RELATIONSHIP BETWEEN INFLATION
AND MONETARY INDICATORS OF MONGOLIA

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ABSTRACT

Including quarterly data from 1994-2004, and based on the classical theory of monetary policy and several empirical research, we have modeled the econometric model that indicate the relationship between money supply, exchange rate and inflation via CPI in the case of Mongolia. A series of tests have been done regarding to the true model. A positive finding is that the money supply and exchange rate have highly effects on inflation. This result may be developed in further study for the inflation targeting policy in Mongolia.

Keywords:	Inflation, Econometric modelling, Econometric testing
JEL Classification:	C30, C,50, C51, C52

I. INTRODUCTION

Many controversies were raised in order to solve for the issues of inflation such as causes of inflation, whether the inflation has negative or positive effects on economy, and how the government can control it though monetary policies…*etc*. Mongolia has undergone dramatic changes during its transition to a market economy, with fundamental restructuring in both the real economy and the financial sector. The policy of Mongolia's monetary authorities has been to keep the growth rate of the money supply stable while dealing with these transition-specific challenges as they occur. In addition, because of Mongolia's climate, which is characterized by extremes of temperature, the Mongolian economy is highly seasonal, and the authorities have occasionally intervened in the foreign exchange market to avoid excessive exchange rate fluctuations stemming from large, weather-related swings in exports and imports. Such a pragmatic approach to monetary policy has been necessary in many transition economies. Therefore, in order to analyze the role of policies during the translation the study will examine the relationship between the monetary policies-though monetary indicators, and the inflation by the establishment of inflation model.

II. LITERATURE REVIEW

When one turns to a discussion of the causes of inflation in developing countries one finds that the literature contains two major competing hypotheses which attempt to explain the phenomenon. First, there is the monetarist model, which sees inflation as a monetary phenomenon, the control of which requires a control of the money supply as a necessary and sufficient condition such that it grows at a rate consistent with the growth of demand for money with stable prices. The monetarist model is predicated upon the existence of a stable demand for money. An existence of stable demand for money in Mongolia itself might be a disputable proposition due to the numerous deep structural changes, which are underway within Mongolian economy since 1990.

Another model is structuralist model, by contrast, argues that the causes of inflation must be sought in certain structural characteristics of developing countries which make them particularly inflation-prone and that elimination of inflation requires that policy be directed toward removing the various bottlenecks which are said to initiate and perpetuate inflation.

Several researches have been set up in sphere of monetarist model. According to Mankiw (Macroeconomics book, 2003), inflation is simply an in crease in overall level of prices, and this can be express in term of money exchange equation:

Velocity (V) * money supply (M) = real GDP*GDP deflator =

= nominal GDP (Y)

Or V = Y/M = (P*Q)/M

Of which: **Q** is the total number of items purchased during period of time

P is the average price level for the economy during period of time

If **V** and **Q** are constant, then we can state the equation of exchange in terms of rates of growth:

The rate of growth of the money supply = the inflation rate.

Intuitionally the economy's overall level of price can be look at the price of a basket of good and services or in other way, it measures the value of money. Because money is used in virtually all economic transactions, it has a powerful effect on economic activity. An increase in the supply of money puts more money in the hands of consumers, making them feel wealthier, thus stimulating increased spending. Business firms respond to increased sales by ordering more raw materials and increasing production. The spread of business activity increases the demand for labor and raises the demand for capital goods. In a buoyant economy, stock market prices rise and firms issue equity and debt. If the money supply continues to expand, prices begin to rise, especially if output growth reaches capacity limits. As the public begins to expect inflation, lenders insist on higher interest rates to offset an expected decline in purchasing power over the life of their loans. Inflation sometimes is defined informally as "too much money chasing too few goods."(Dwyer and Hafer,1999). This statement implied that a rise in the price level means a lower value of money because now people have to pay more for smaller quantity of good and services. The statement also captures important aspects of why money growth is related to inflation. Still, it is better to define inflation as increases in the general level of prices rather than in terms of why increases in the general price level occur. In the researcher 1998, Rolnick and Weber found that there were extremely high correlation between money growth and inflation. Moreover, they also indicated that the strength of the relationship does not vary with the measure of money used. The correlation between money growth, measured by primary money, secondary

money, or M2, and inflation is always 0.99. That shows the linear relation between monetary growth and inflation. By the research in 2004 D.Gan-Ochir considered monetary factors that influence inflation. Consequently, he has established the relationship between the monetary aggregates and did prediction of inflation rate in the next years. Other research by D. Bathsukh (2003) was also set up the dynamic model to forecast the change in inflation rate based on monetary growth.

In addition, exchange rate is also considered as one of factors affects inflation. Basically, the exchange rate measures the price of one currency in term of others. In the very short term, it is the only variable explaining inflation directly or in other words, if the exchange rate changes, businesses immediately react by adjusting domestic prices. Sluk (2002) found that the exchange rate has a significant effect on inflation during all time periods examined in Mongolia. The country's experiences seasonal movements in the exchange rate, which, if left unsmoothed, could have undesirable effects on inflation An another research done by Siliverstovs and Bilan (2005) in Ukraine also shows that there is a close link between exchange rate development and inflation. In fact, in all cases, reduction of inflation was due to lower import prices. The credibility the Bank of Mauritius has recently established with its 'inflation targeting lite' regime has allowed it to shift from an emphasis on exchange rate targeting towards inflation targeting.

This paper will develop a macro finance model for the inflation case, allowing the investigation of Mongolia experience with inflation targeting as described in Stone (2003). By estimating a model in which the yield curve is modeled explicitly we are able to obtain estimates of inflation expectations.

III. METHODOLOGY

In this study, in order to analyze the phenomenon of inflation in case of Mongolia, firstly, we will do the secondary research to develop our theory that is a base for building the model. The method of Ordinary Least Square (OLS) is employed basing on the statistics and data from the IMF to estimate our built model.

Data used in this study are quarterly spanning 1995-2004 (including 40 data points or observations) that sourced from IMF. We start with the year 1995 as it was marked by relative stabilization of macroeconomic indicators compared to severe economic decline and hyperination observed in earlier periods.

Basing on our discussion from the above, we could therefore choose the following variables:

Consumer price index, CPIt that reflects the change in average level of prices

Exchange rate, in logs: $LnEx_t$ ($Togrogs/$US)

Money supply: narrow money M1 and broad monetary aggregate M2, in logs: LM1t, LM2t respectively (millions of Togrogs end of the period), and our model will be: $CPI_t = \gamma_0 + \gamma_1 \ln(M1)_t + \gamma_2 \ln(M2)_t + \gamma_3 \ln(Ex)_t + u_t$

Practically, in term of studying the relationship between money supply, exchange rate and inflation, the Lin-Log model will be able to express the percent growth in inflation of Mogolia (via CPI) for an absolute change in money supply and exchange rate as well. Let us interpret the slope coefficient:

$$\gamma_i = \frac{Change\,in\,\inf lation}{Change\,in\,Ln(M,Ex)} = \frac{Change\,in\,Y}{\operatorname{Re}latieve\,change\,in\,X}$$

IV. RESULTS

Assume that we have already constructed the true model which expresses the effects of money supply and exchange rate on inflation in Mongolia as discussed above:

$$CPI_t = \gamma_0 + \gamma_1 \ln(M1)_t + \gamma_2 \ln(M2)_t + \gamma_3 \ln(Ex)_t + u_t$$

Now, we start running the regression for our model. The results will give as (Appendix A):

CPI = -444.9306351 + 10.0572671*LNM1 + 8.400272755*LNM2 +

+ 46.1229659*LNEX

Se = (13.27225)   (6.467621)   (4.175690)   (5.160813)

t = (-33.52337)   (1.555018)   (0.0518)   (8.937150)

P = (0.0000)   (0.1287)   (0.0000)   (0.0000)

R-squared = 0.979083; n = 40; F-statistic = 561.7073

Interpreted in the manner described earlier the equation states that an increase in money supply or exchange rate of 1 percent, on average, leads to about 0.10 M1; 0.84 M2 and 4.61 increases respectively.

4.1. Test for multicollinearity

$$LogM2_t = \lambda * LogM1_t + v_t$$

From the estimated results we can see that R2 is high (0.979083) and positive coefficients of predictors. However, these regressors log (M1) and log (M2) are statistically insignificant t-test. Thus, we should suspect that those two variables may be mutually correlated. According to Gujarati (2004: 347), generally there is no exactly linear relationship among the estimated variables, especially in data involving economic time series. In our case, the less perfect multicollinear between the variable can be expressed as:

where v_i is a stochastic error term.

To find out the problem, we firstly carry out a pair-wise correlation. It can be shown in the table below:

Table 1. The pair-wise correlation between variables

	LNM2	LNM1	LNEX	CPI
LNM2	1.00	0.97	0.82	0.92
LNM1	0.97	1.00	0.90	0.96
LNEX	0.82	0.90	1.00	0.96
CPI	0.92	0.96	0.96	1.00

It is clearly seen that correlation between M1 and M2 (r_{12} exceeds 0.9) is too high that will cause large variance because:

$$Cov(\hat{\gamma}_1, \hat{\gamma}_2) = \left. -r_{12}^2 * \delta^2 \middle/ (1 - r_{12}^2) * \sqrt{\sum x_{1i}^2 \sum x_{2i}^2} \right.$$

As collinearity increases, the covariance of two estimators increases, and reaches infinity as r12 = 1. Thus, then multicollinearity is serious problem. To solve the problem, we will drop one variable out of the model.

Actually, from the critical study in term of macroeconomics in the previous section, we know that M2 is broad money which includes M1. This might be a main cause of multicollinearity. We therefore get M1 out of our model, and our new model can be shown as:

$$\hat{CPI}_t = \gamma + \gamma_1 \ln(M2)_t + \gamma_2 \ln(Ex)_t + u_t$$

With the new model, we run the regression and a result given in the Appendix B.

CPI = -444.1762526 + 52.06044786*LNEX + 14.46126832*LNM2

Se = (13.50161)   (3.486649)   (1.607987)

t = (-32.89803)   (14.93137)   (8.993398)

P = (0.0000)   (0.0000)   (0.0000)

R-squared = 0.979083; n = 40; F-statistic = 811.8012

The results show that after getting M1 out of the model, the standard errors are quite small in comparison with its coefficients. t values are large and P values equal to zero that both are significant. However, the DW indicator is a bit small. It might tell us about autocorrelation.

4.2. Test for autocorrelation

From the regression, we see that the Durbin-Watson stat is not much significant (d =1.335499). That result might make us be suspect that there is an autocorrelation. This phenomenon means that the error terms are interrelated – that is, prior error information influences the value of the current error term. The current error term can be written as some function of previous error terms:

$$u_t = \alpha u_{t-1} = v_t$$

Thus, for more precise we will look at the residual's graph:

Figure 1. Residuals graph
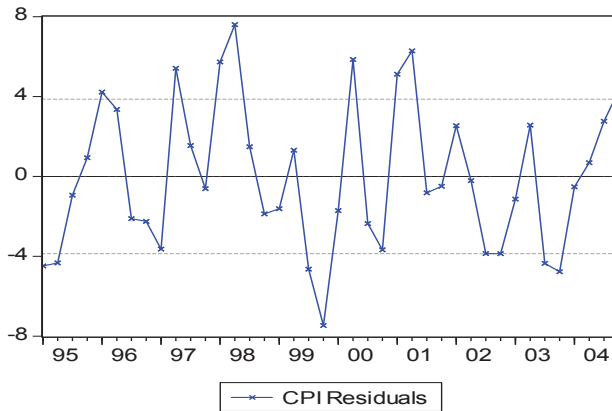
The graph tells us that CPI of previous period also affects the next period and that will occur over time.

Breusch-Godfrey test

However, to avoid some pitfalls of the Durbin-Watson test, we will apply the Breusch-Godfrey (BG) test of autocorrelation that is general in the sense of allowing for non-stochastic regressors such as the lagged value of regression. This lagged value can be then added to the model.

Recall the model: $\hat{CPI}_t = \gamma + \gamma_1 \ln(M2)_t + \gamma_2 \ln(Ex)_t + u_t,$

and assume that error term u_t follows the p_{th}-order autoregressive, AR(p):

$$u_t = \rho_1 u_{t-1} + \rho_2 u_{t-2} + ... + \rho_p u_{t-p} + \varepsilon_t$$

To treat this problem, we will put lagged variable in our model. The new model then will be:

$$CPI_t = \gamma_0 + \gamma_1 \ln(M2)_t + \gamma_2 \ln(Ex)_t + AR(1) + u_t$$

Based on the new model, we run the regression to obtain the result as:

CPI = -428.7244058 + 47.45893757*LNEX + 15.76219538*LNM2 +

    + [AR(1)=0.3118824325]

Se = (21.21859)	*(5.194420)*	*(2.177666)*	*(0.158977)*
t = (-20.20513)	*(9.136522)*	*(7.238113)*	*(1.961804)*
P = (0.0000)	*(0.000)*	*(0.0000)*	*(0.0578)*

R-squared = 0.977752; n = 39; F-statistic = 512.7198; d = 1.843902

Under the null hypothesis of no serial autocorrelation: $H_0 : \rho_1 = \rho_2 = 0$, then we now calculate the BG: $(n - p)R^2 \approx X^2_p$ based on our output of BG serial autocorrelation (Appendix D).

$$(n - p)R^2 = (40 - 1)* 0.0712598 = 2.779132$$

Choose α = 5%, we have $\chi^2_1 = 3.84146 > (n-p)*R_2 = 2.779132$, thus, we fail to reject the null hypothesis of no serial autocorrelation, and obviously there is no need to consider more than one lag.

Durbin Watson test

The new model with Durbin-Watson stat. d = 1.843902 is close to 2 that mean we can confidently say that there may be slightly positive autocorrelation (also see Appendix C).

With 39 observations and three explanatory variables (excluding the intercept term), we will have a significant points of d_L and d_U at 5% significant level as: d_L =1.137 d_U =1.453.

Assume: H_0: $\sigma = 0$ versus H_1: $\sigma \neq 0$, and $d_U = 1.453 < d = 1.843902 < 4 - (d_U = 1.453)$

$d_U = 1.453 < d = 1.843902 < 2.547$ that, there is statically significant evidence of no autocorrelation either positive of negative.

Run test

In order to ensure our results we should carry out another test. Then Run Test will be employed as:

Table 2. Autocorrelation Run test

Residuals	+/_	Runs	Residuals	+/_	Runs	Residuals	+/_	Runs
-4.8528	-	1	1.2568	+	6	2.5433	+	12
-3.9983	-	1	-2.0682	-	7	1.3490	+	12
-1.1564	-	1	-4.3533	-	7	-3.2445	-	13
0.9175	+	2	0.9769	+	8	-3.3716	-	13
4.3353	+	2	-4.8388	-	9	-1.5395	-	13
3.9813	+	2	-7.0217	-	9	3.3382	+	14
-1.1111	-	3	-1.3120	-	9	-4.2132	-	15
-1.9032	-	3	7.6848	+	10	-5.6327	-	15
-5.5244	-	3	-0.8630	-	11	-1.8285	-	15
5.1231	+	4	-3.0439	-	11	0.7297	+	16
1.7559	+	4	4.9077	+	12	2.0137	+	16
-1.1077	-	5	7.4473	+	12	2.4997	+	16
4.0432	+	6	0.0545	+	12			
7.6305	+	6	0.3965	+	12			

$N_1 = 20$: number of positive signs (+ residuals); $N_2 = 20$: number of negative signs (- residuals)

N: total number of observations = $N_1 + N_2 = 40$; R = 16: number of runs

Thus, Mean: $E(R) = \dfrac{2N_1N_2}{N} + 1 = \dfrac{2*20*20}{40} + 1 = 21$

and variance $\sigma_R^2 = \dfrac{2N_1N_2(2N_1N_2 - N)}{N^2(N-1)} = \dfrac{2*20*20*(2*20*20-40)}{40^2*(40-1)} = 9.7436$

Now we construct the probability of 95% that the preceding interval will include R:

$$\Pr[E(R) - 1.96 * \sigma_R \le R \le E(R) + 1.96 * \sigma_R = 0.95$$

$$<=> \Pr[21 - 1.96 * 3.1215 \le R \le E(R) + 1.96 * 3.1215 = 0.95$$

$$<=> \Pr[14.8819 \le R \le 27.1181 = 0.95$$

It is clearly seen that R falls inside the interval that means the null hypothesis of randomness is satisfied. We then ensure that there is no autocorrelation in our model.
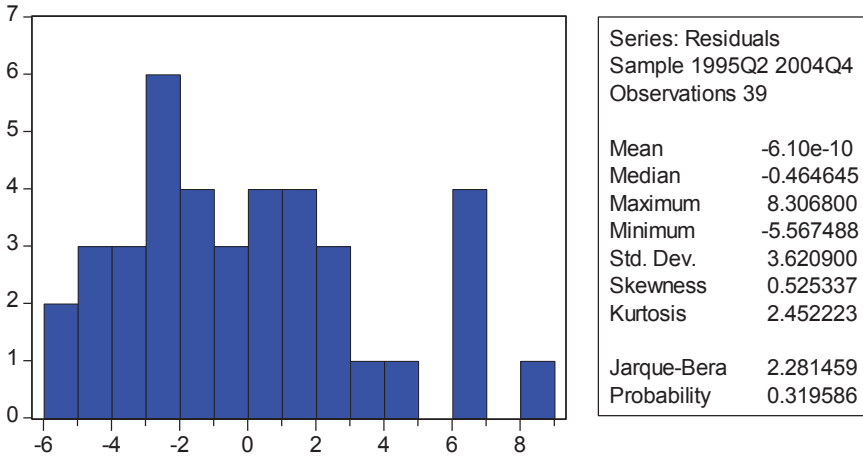
4.3. Test normality of the error term

The Jarque-Bera is a test of normality that is actually based on the OLS residuals. The JB test is valued at:

$$JB = n * [\frac{S^2}{6} + \frac{(K-3)^2}{24}];$$

where K = Kurtosis coefficient, and S is Skewness. For normality S=0 and K = 3. Therefore the value of JB test is expected to be zero. By using eview, we have obtained a result as:

Figure 2. Linear relationship between M2, exchange rate and CPI

Series: Residuals	
Sample 1995Q2 2004Q4	
Observations 39	
Mean	-6.10e-10
Median	-0.464645
Maximum	8.306800
Minimum	-5.567488
Std. Dev.	3.620900
Skewness	0.525337
Kurtosis	2.452223
Jarque-Bera	2.281459
Probability	0.319586

The Jarque-Bera statistic is 2.81459 and the p-test is large, so we cannot reject the null of normality. If the p-statistic was very low (0.05 and below) we could reject the null of normality. The magnitude of the JB test is not large – it is a function of the sample size, and there are 51 observations so this is quite a reasonable figure. The Kurtosis is close to 3, and the Skewness is close to 0, and the observed histogram is reasonably bell-shaped. We can be quite comfortable that the residuals are essentially normally distributed.

4.4. Heteroskedasticity Test:

Recall that one of the important assumptions of the classic linear regression model is that the variance of each disturbance term U_i, conditional on the chosen values of the explanatory variables, is some constant number equal to σ^2. Symbolically, it can be expressed as:

$$E(u^2_i) = \sigma^2, \quad i = 1, 2, 3….n$$

With this assumption of homoskedasticity, our OLS will be BLUE. Thus, to ensure whether our model satisfies the assumption or not, it is very necessary to check heteroskedasticity. Actually, this phenomenon is that the conditional variance of Y_i is not a constant. It increases as explanatory Xij increases that means:

$$E(u^2_i) = \sigma_i^2, \quad i = 1, 2, 3….n$$

Actually, if our model is heteroskedasticity, it may cause series of problems such as unbiased estimating of coefficients of explanatory variables, unnecessarily larger confidence interval. As consequence, a result of t-test and F-test will statistically be incorrect. To cope with the problem, there are several test can be employed to test our model whether there is heteroskedasticity in the data.

White's general heteroskedasticity test

This method require reordering the observations with respect to the X variable that supposedly caused heteroskedasticity. Generally, it is widely used as it does not rely on the normality assumption and easily to implement. By applying the method to the residuals obtained from regression, we have the following result (Appendix E).

Table 3. General heteroskedasticity test

F-statistic	0.815692	Probability		0.547174
Obs*R-squared	4.289823	Probability		0.508487
Variable	Coefficient	Std. Error	t-Statistic	Prob.
C	4073.239	6137.111	0.663706	0.5115
LNEX	-297.5633	726.8197	-0.409405	0.6849
LNEX^2	-106.8754	138.8841	-0.769530	0.4471
LNEX*LNM2	147.6774	175.6612	0.840694	0.4066
LNM2	-507.0660	750.9706	-0.675214	0.5042
LNM2^2	-21.23811	23.76528	-0.893661	0.3780
R-squared	0.109995	Mean dependent var		12.73883

Under the null hypothesis that there is no heteroskedasticity, we have $n*R^2$ follows the χ^2_{df} distribution:

$$n * R^2 \sim \chi^2_{df} = 0.109614 * 39 = 4.274946$$

Choose the critical chi_square value for 5 df, we have:

for 5%, $\chi^2_{df=5} = 11.0705 > n*R^2$,

for 10%, $\chi^2_{df=5} = 9.2363 > n*R^2$,

for 25%, $\chi^2_{df=5} = 6.62568 > n*R^2$

Thus, for all our practical purposes, we can conclude that there is no heteroskedasticity in our data.

Goldfeld - Quandt test

This is also a popular method that is applicable if one as assumes the heteroskedastic variance, σ^2_i is positive related to one of the explanatory variables in the regression model. Suppose σ^2_i is positive related to exchange rate and money supply as:

$$\sigma^2_i = \sigma^2 * X^2_i$$

Then, we, in turn, rank exchange rate and money supply as:

Before ranking, we will choose c central observation. Empirically, our data has 40 observation, so c value will be 8.

+ Ranked by the exchange rate with the lowest X value, then omitting c = 8 observations from central

The regression based on the first 16 observations is:

CPI = -559.6518656 + 42.29864703 * LNEX + 29.75274908 * LNM2 +

+ [AR(1)=-0.0306494754]

with $RSS_1 = 154.3905$

-The regression based on the last 16 observations is:

CPI = -1664.423233 + 266.3944239*LNEX - 7.478146541*LNM2 +

+ [AR(1)=-0.2160531046]

with $RSS_2 = 124.9626$

From these results we obtain: $\lambda = \dfrac{RSS_2 / df}{RSS_1 / df} = \dfrac{154.3905/12}{124.9626/12} = 1.235494$

The critical F value for 12 df of both numerator and denominator at 5 percent level is 2.69, exceeds the estimated $F(\lambda)$. Thus, we may conclude that there is no heteroskedasticity in the error variance.

+Ranked by the money supply, then omitting c = 8 observations from central,

-The regression based on the first 16 observations is:

CPI = -611.7827184 + 38.13089521*LNEX + 36.50800683*LNM2 +

+ [AR(1)=-0.329436164]

with RSS_1 = 125.20707

-The regression based on the last 16 observations is:

CPI = -1438.982408 + 227.4055316*LNEX - 3.749316657*LNM2 +

+ [AR(1)=-0.01690232852]

with RSS_2 = 129.4435

We also obtain: $\lambda = \dfrac{RSS_2 \, / \, df}{RSS_1 \, / \, df} = \dfrac{125.20707/12}{129.4435/12} = 0.96727$

Similarity, at 5 percent level is 2.69, the estimated $F(\lambda)$ is smaller that means there is no heteroskedasticity in the error variance.

4.5. Spearman's Rank correlation test

Apart from two test above, we also apply other test is Spearman's rank test. To do this, we firstly estimate the Spearman's rank correlation coefficient as:

$$r_s = 1 - 6\left[\frac{\sum d_i^2}{n(n^2 - 1)} \right];$$

where d_i is different in the ranks assigned to two different characteristics of i_{th} individual and n is the number of individual ranked. Run the regression to find u_i. Then, rank u_i, m_2 and ex, we have obtained the table as:

Table 4. Rank correlation test of Heteroskedasticity

Ru_i	Rex	d_{1i}	d^2_{1i}	Rm_2	d_{2i}	d^2_{2i}	Ru_i	Rex	d_{1i}	d_{2i}	Rm_2	d_{2i}	d^2_{2i}
9	40	-31	961	40	-31	961	30	18	12	144	20	10	100
15	39	-24	576	39	-24	576	1	21	-20	400	19	-18	324
32	38	-6	36	36	-4	16	37	19	18	324	17	20	400
36	37	-1	1	37	-1	1	20	16	4	16	18	2	4
12	36	-24	576	38	-26	676	8	15	-7	49	16	-8	64
16	35	-19	361	35	-19	361	3	17	-14	196	15	-12	144
33	34	-1	1	33	0	0	40	14	26	676	14	26	676
25	33	-8	64	32	-7	49	39	13	26	676	13	26	676
6	28	-22	484	34	-28	784	21	12	9	81	12	9	81
7	32	-25	625	31	-24	576	29	11	18	324	11	18	324
27	31	-4	16	30	-3	9	19	10	9	81	10	9	81
34	30	4	16	24	10	100	17	9	8	64	9	8	64
14	29	-15	225	29	-15	225	28	7	21	441	8	20	400
2	27	-25	625	27	-25	625	18	8	10	100	7	11	121
31	26	5	25	26	5	25	13	6	7	49	6	7	49
23	25	-2	4	25	-2	4	5	5	0	0	5	0	0
11	23	-12	144	28	-17	289	26	3	23	529	4	22	484
35	24	11	121	23	12	144	38	4	34	1156	3	35	1225
10	22	-12	144	22	-12	144	24	2	22	484	2	22	484
4	20	-16	256	21	-17	289	22	1	21	441	1	21	441
										11492			11996

As resulting in the table, we now calculate:

+ Correlation coefficient between u_i and exchange rate:

$$r_s^1 = 1 - 6\left[\frac{11942}{40*(40^2-1)}\right] = \text{-0.0780488} \Rightarrow$$

$$t = \frac{r_s * \sqrt{n-2}}{\sqrt{1-r_s^2}} = \frac{\text{-0.0780488}*\sqrt{40-2}}{\sqrt{1-(\text{-0.0780488})^2}} = \text{-0.482597138}$$

Choose level of significant Choosing the significant level $\alpha = 1\%$, we have $t_c = t_{0.05,\,38} = 2.0315$

It is clearly seen that $t_c >$ computed $|t|$, thus there we may reject the null hypothesis of heteroskedasticity.

Similarity, we can obtain the correlation coefficient between u_i and money supply:

$$r_s^1 = 1 - 6\left[\frac{11996}{40*(40^2-1)}\right] = \text{-0.12532833} \implies$$

$$t = \frac{r_s * \sqrt{n-2}}{\sqrt{1-r_s^2}} = \frac{\text{-}0.12532833 * \sqrt{40\text{-}2}}{\sqrt{1-(\text{-}0.12532833)^2}} = \text{-0.778715637} \implies |t| < t_c = 2.0315$$

From the test, there is no evidence of systematic relationship between the explanatory and the absolute value of residual, which might suggest that there is no heteroskedasticity.

In fact, there is an another test, Breusch-Pagan-Godfrey, which may use to test the heteroskedasticity. However, strictly speaking, the BPG test is an asymptotic, large sample, test and in the present example 40 observations may not constitute a large sample. With three tests previously done, we can be confident to get out of the heteroskedasticity problem.

4.6. Chow test for structure stability

Mongolia's experience has been different from that of most other transition countries. The country experienced a prolonged period of moderate inflation. Annual inflation fell below 10 percent in the first half of 1998 and has stayed low since then. However, it started raising in the decade of 20's. In our study we will beak into two periods in order to find out whether there is a stability or not. The results of study can be express as:

• *The period of 1995Q1-2000Q2*

   CPI1 = -519.8966475 + 35.0751438*LM21 + 30.3497092*LNEX1 +
                          + [AR(1)=0.4030732445]

   Se = (60.21990)   (8.477368)   (8.099753)   (0.219053)

   t = (-8.633303)   (4.137504)   (3.746992)   (1.840071)

   n$_1$ = 21 observations after adjustments

   R-squared = 0.967749; RSS1 = 256.3921; F-statistic = 170.0387

• *The period of 2000Q3-2004Q4*

   CPI2 = -605.8891237 + 83.80639366*LM22 + 9.764379148*LNEX2 +
                          + [AR(1)=0.227024803]

   Se = (665.0433)   (110.9730)   (9.370922)   (0.275093)

$t = (-0.911052)$ (0.755196) (1.041987) (0.825266)

n_2 = 17 observations after adjustments

R-squared = 0.813054; RSS_2 = 171.0886; F-statistic = 18.84624

Then

$$\hat{\sigma}_1{}^2 = \frac{RSS_1}{n_1 - 4} = \frac{256.3921}{4} = 64.09803 \; ; \; \hat{\sigma}_2{}^2 = \frac{RSS_2}{n_2 - 4} = \frac{171.0886}{4} = 42.77215$$

and $F = \dfrac{\hat{\sigma}_1^2}{\hat{\sigma}_2^2} = \dfrac{64.09803}{42.77215} = 1.49859$,

follows the distribution $F_{(n_1-k, n_2-k)} = F_{(13,17)} = 2.345$

We can see that F< F_c then we cannot reject the null and we can use the Chow test.

We have R_{UR}= RSS_1 + RSS_2 = 256.3921 + 171.0886 = 427.4807 with

df = (n_1+n_2-2k) = (21+17)-2*4= 30

$$F = \frac{(RSS_R - RSS_{UR})/k}{RSS_{UR}/(n1+n2-2k)} \sim F_{k,n1+n2-2k} , =>$$

$$F = \frac{(498.2149 - 427.4807)/4}{427.4807/(30)} = \frac{17.68355}{14.24936} = 1.24101$$

$F_{k,n1+n2-2k} = F_{4,30} = 2.69$ excesses the computed F, we can therefore fail in rejecting the null hypothesis that means there is no structure change or break.

4.7. Test for specification errors

One of the assumptions of the class linear regression model is that the regression model used in the analysis is correctly specified. If the model is not correctly specified , we will encounter the problem of model specification error or bias. Thus, in the case of the inflation model, we will test for this assumption. Ramsey's RESET test is one of general test for specification error. Assume we introduce the dependent variable CPI in some form as regressor, it should increase R^2.

$$CPI_t = \gamma_0 + \gamma_1 \ln(M2)_t + \gamma_2 \ln(Ex)_t + \gamma_3 \ln(\hat{CPI})_t + u_t \qquad (1)$$

If the increase in R^2 is statistically significant on the basic of F-test, it will suggest that the model is mis-specified.

We now run the regression of model (1), the result obtained as (also see Appendix 7):

CPI = -278.4594666 - 4.407466826*LNEX + 8.725926792*LNM2 +

+ 32.52046365*LN(CPI)$_t^2$ + [AR(1)=0.2675383112]

with R^2 = 0.979413; d = 1.753358

Then, $F = \dfrac{(R^2_{new} - R^2_{old})/df1}{(1 - R^2_{new})/df2} = \dfrac{(0.979413 - 0.977752)/1}{(1 - 0.979413)/34} = 2.743187$

Where, df$_1$ is the number of new regressor; df$_2$ = n - number of parameters in the new model

Choose level of significant α = 5%, then $Fc = F^{\alpha}_{df1,df2} = F^{0.05}_{1,34} = 4.125$.

Obviously, F_c is exceeds the computed F that indicates that the model is not mis-specified.

An another test for omitted variable is Wald test. This is a really common and regularly used restriction test, but is better for large samples. In this study, because of limited observation, we will not employ the test here. We therefore use other method which will be shown in the next part (F-test for incremental variable)

4.8. Test for an incremental of an explanatory variable

In previous part, we also tested successfully for specification error. However, some economists argue that increase in bank interest rates has pushed up inflation. In fact, consumers and investors will face higher borrowing costs as interest rate increases. As consequently that will push up price at higher level. In the case of Mongolia, we will assume that interest rate also affects inflation, we then add it to the model to find out whether it has any effect on inflation:

$$CPI_t = \gamma_0 + \gamma_1 \ln(M2)_t + \gamma_2 \ln(Ex)_t + \gamma_3 \ln(Int)_t + u_t$$

Run regression we have (Appendix 8):

CPI = -453.1666117 + 16.02227963*LNM2 + 1.065209573*LNINT +

+ 50.08061664*LNEX + [AR(1)=0.3356005178]

with R^2 = 0.977935; F-statistic = 376.7226; d = 1.826516

From the initial model, we have

CPI = -428.761292 + 15.70320991*LOG(M2) + 47.56844772*LOG(EX) +

+ [AR(1)=0.3115417286]

Se = (-20.19801)   (2.173094)   (5.187411)   (0.159050)

t = (21.22790)   (7.226200)   (9.169978)   (1.958765)

P = (0.0000)   (0.0000)   (0.0000)   (0.0581)

R-squared = 0.977752; df = 39; F-statistic = 512.7198

$$F = \frac{(R^2_{new} - R^2_{old})/df_1}{(1 - R^2_{new})/df_2}$$

Where, df_1 is the number of new regressor, df_2 is the number of parameters in the new model.

$$F = \frac{(0.977935 - 0.977752)/1}{(1 - 0.977935)/34} = \frac{0.00183}{0.000649} = 0.281985 < F_{1,34}^{0.05} = 4.125.$$

It is clearly seen that Interest rate does not affect inflation in Mongolia. Therefore, we will get the interest rate out of the model.

4.9. *Testing the overall significance of the multiple regression using F test.*

According to Gujarati (2004: 257), to test overall significance of the regression, F test can be employed to test the null hypothesis that all slope coefficients, γ_1 and γ_2, are simultaneously zero (H_0). Alternatively, one or all of those will not be equal to zero (H_1).

Recall our regression result (see Appendix 6):

CPI = -428.761292 + 15.70320991*LOG(M2) + 47.56844772*LOG(EX) +

+ [AR(1)=0.3115417286]

Se = (-20.19801)   (2.173094)   (5.187411)   (0.159050)

t = (21.22790)   (7.226200)   (9.169978)   (1.958765)

P = (0.0000)   (0.0000)   (0.0000)   (0.0581)

R-squared = 0.977690; df = 39; F-statistic = 511.2607

Choose level significant α = 5%, we have: $F_{\alpha(k-1,n-k)} = F_{0.05(3,36)} = 2.88$

The F statistic tells us that the estimated parameters for the regression are effective, and so under the null hypothesis that there is no relationship between money supply, exchange rate and CPI this model is well estimated.

The p-value for this F statistic is practically zero. We can confidently use this as evidence to reject the null hypothesis, so this indicates that there is a relationship between money supply, exchange rate and CPI. Thus, we can confidently reject the null hypothesis that M2, exchange rate has no effect on CPI.

We can also express linear relationship between CPI and other estimated regressors by the graph (Figure 1).

Figure 3. Linear relationship between M2, exchange rate and CPI
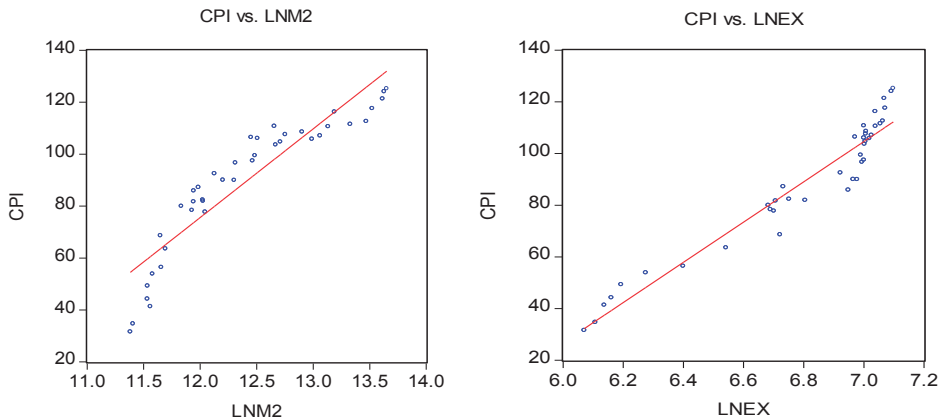
4.10. Testing the about individual regression coefficients using T test.

Recall the assumption of OLS that u_i follows $N(0,\sigma^2)$ distribution to ensure that γ_1, γ_2, γ_3 are minimum variance estimators in the entire class of unbiased estimators or in short they are BLUE. Thus, we will apply t-test to test hypotheses about individual partial regression 3coefficients for our CPI model:

$$\hat{CPI}_t = \gamma + \gamma_1 \ln(M2)_t + \gamma_2 \ln(Ex)_t + AR(1) + u_t$$

Since, CPI, M2 and Ex are expected to be positively related as we mentioned in the previous part. We should therefore use right tail-test, that is:

$$t = \frac{\hat{\gamma}_1 - \gamma_1}{Se(\hat{\gamma}_1)} = \frac{15.70321 - 0}{2.173094} = 7.22620$$

Assume that under the null hypothesis Ho: $\gamma_1 \leq 0$, alternately H_1: $\gamma_1 > 0$ (other variables hold constant).

Choose level of significant $\alpha = 5\%$, we have: $t_{0.025, 35} = 2.0315$, is smaller in comparison with the computed t. Thus, we can be comfortable to reject the null hypothesis that there is no relationship between CPI and M2. Actually we can look at P value is statistically significant (P = 0).

Similarity, we also test for the relation between CPI and Exchange rate. With P value equals to zero and t-test excesses the critical $t_{0.025, 35}$, we can then conclude that CPI and Ex have a positive relationship.

4.11. Test for the equality of two regression coefficients

Actually, testing the equality of two regression coefficients is of practical important. Under the null hypothesis we assume that two coefficients are identical that means the coefficients (or elasticity in the case of variables expressed in logarithmic form) of money supply and exchange rate is the same.

$$CPI = -428.761292 + 15.70320991*LOG(M2) + 47.56844772*LOG(EX) + $$
$$+ [AR(1)=0.3115417286]$$

Se = (-20.19801)	(2.173094)	(5.187411)	(0.159050)
t = (21.22790)	(7.226200)	(9.169978)	(1.958765)

$R2 = 0.977719$ $Cov(\hat{\gamma}_1, \hat{\gamma}_1) = -4.612292$

Now we should test:

$$H_0: \gamma_1 = \gamma_2 \text{ or } \gamma_1 - \gamma_2 = 0$$

Alternatively, H_1: $\gamma_1 \neq \gamma_2$.

Follows the classical assumption, we have:

$$t = \frac{(\hat{\gamma}_1 - \hat{\gamma}_2) - (\gamma_1 - \gamma_2)}{Se(\hat{\gamma}_1 - \hat{\gamma}_2)}; \text{ where}$$

$$Se(\hat{\gamma}_1 - \hat{\gamma}_2) = \sqrt{(var(\hat{\gamma}_1) + var(\hat{\gamma}_2) - 2cov(\hat{\gamma}_1, \hat{\gamma}_2)} = $$

$$= \sqrt{(2.173094)^2 + (5.187411)^2 - 2*(-4.612292)} = 6.391822$$

$$t = \frac{(15.7032 - 47.5684) - 0}{6.3918} = -4.9853$$

Choosing the significant level α=5%, we have t_c = $t_{0.05,\ 39-4}$=2.0315. For 35 df, the absolute value t observed excesses the t_c value and the P value is extremely small, thus, we can reject the null hypothesis that coefficients of money supply and exchange rate are identical.

4.12. Confidence intervals for coefficients

Because of sampling fluctuations, a single estimate is likely differ from the true value, although in repeated sampling its mean value is expected to be equal to the true value. Therefore, instead of relying on the point estimated alone, we may construct an interval around the point estimator such as for coefficient γ_1 and γ_2. Under the assumption of OLS, all coefficients follow normal distribution. We can then use t distribution to establish the confidence interval:

$$\Pr\left[-t_{\alpha/2} \le t = \frac{(\hat{\gamma}_i - \gamma_i)}{Se(\hat{\gamma})} \le t_{\alpha/2}\right] = 1 - \alpha$$

$$\text{or } \Pr\left[\hat{\gamma}_i - t_{\alpha/2} * Se(\hat{\gamma}_i) \le \gamma_i \le \hat{\gamma} + Se(\hat{\gamma}_i) * t_{\alpha/2}\right] = 1 - \alpha \qquad (2)$$

Choosing the significant level α =5%, that is, 95 % confidence coefficient then we have:

t_c = $t_{0.025,\ 39-4}$= 2.0315, substituting in (2):

The confidence interval for γ_1:

$$\Pr\left[47.45894 - 2.0315 * 5.194420 \le \gamma_1 \le 47.45894 + 2.0315 * 5.194420\right]$$

$$\Leftrightarrow 36.90648 \le \gamma_1 \le 58.0114$$

This interval is the probability that the specified fixed interval includes γ_1

The confidence interval for γ_2:

$$\Pr\left[\hat{\gamma}_i - t_{\alpha/2} * Se(\hat{\gamma}_i) \le \gamma_i \le \hat{\gamma} + Se(\hat{\gamma}_i) * t_{\alpha/2}\right] = 1 - \alpha$$

$$\Pr\left[15.76220 - 2.0315 * 2.177666 \le \gamma_2 \le 15.76220 + 2.0315 * 2.177666\right]$$

$$\Leftrightarrow 11.33827 \le \gamma_2 \le 20.18613$$

Again the interval is the probability that the specified fixed interval includes γ_2

In short, given the confidence coefficient of 95%, in the long run, in 95 out of 100 cases interval like (36.90648; 58.0114) and (11.33827; 20.18613) will

contain the true γ_1 and γ_2 respectively.

V. DISCUSSION

Based on the econometric techniques, the series of tests have been done taking into account of the inflation model. The equation shows that inflation is strongly affected by exchange rate and money growth changes and that the pass-through is fast. Changes inflation of the prior period also has a significant impact on current inflation , but this effect takes longer to work its way through the economy than money supply and exchange rate changes. Results of the tests suggest that we has found extremely high correlation between money growth, exchange rate and inflation. The model points to a dominant role of monetary policies in the behavior of inflation and shows a low persistence of inflation in Mongolia. Both factors contributed to the observed behavior of inflation.

VI. CONCLUSION

Our results are based on limited money, exchange rate and CPI data from 1995-2004. The econometric results show that it is feasible to estimate robust money supply, exchange rate and inflation equations for Mongolia. The model expresses inflation as a function of money, and the exchange rate, and may be interpreted as portraying equilibrium in the goods market. In fact, the dynamics of inflation are strongly affected by current exchange rate changes and money growth that implications and ultimately designing better monetary policies and institutions. Our hope is that this study will stimulate research on models of monetary standards and encourage efforts to obtain better data on the experiences of countries under alternative monetary standards.

APPENDIX A. ESTIMATION OF THE INFLATION MODEL WITH M1,M2 AND EXCHANGE RATE VARIABLES

$$CPI_t = \gamma_0 + \gamma_1 \ln(M1)_t + \gamma_2 \ln(M2)_t + \gamma_3 \ln(Ex)_t + u_t$$

Dependent Variable: CPI
Included observations: 40

Variable	Coefficient	Std. Error	t-Statistic	Prob.
C	-444.9306	13.27225	-33.52337	0.0000
LNM1	10.05727	6.467621	1.555018	0.1287
LNM2	8.400273	4.175690	2.011709	0.0518
LNEX	46.12297	5.160813	8.937150	0.0000

R-squared	0.979083	Mean dependent var	89.11825
Adjusted R-squared	0.977340	S.D. dependent var	25.68324
S.E. of regression	3.866128	Akaike info criterion	5.637024
Sum squared resid	538.0901	Schwarz criterion	5.805912
Log likelihood	-108.7405	F-statistic	561.7073
Durbin-Watson stat	1.335499	Prob(F-statistic)	0.000000

APPENDIX B. ESTIMATION OF THE INFLATION MODEL WITH M2, EXCHANGE RATE VARIABLES

$$\hat{CPI}_t = \gamma + \gamma_1 \ln(M2)_t + \gamma_2 \ln(Ex)_t + u_t$$

Dependent Variable: CPI

Included observations: 40

Variable	Coefficient	Std. Error	t-Statistic	Prob.
C	-444.1763	13.50161	-32.89803	0.0000
LNEX	52.06045	3.486649	14.93137	0.0000
LNM2	14.46127	1.607987	8.993398	0.0000

R-squared	0.977719	Mean dependent var	89.11878
Adjusted R-squared	0.976515	S.D. dependent var	25.68324
S.E. of regression	3.935948	Akaike info criterion	5.650219
Sum squared resid	573.1923	Schwarz criterion	5.776885
Log likelihood	-110.0044	F-statistic	811.8012
Durbin-Watson stat	1.418096	Prob(F-statistic)	0.000000

APPENDIX C. ESTIMATION OF THE INFLATION MODEL WITH M2, EXCHANGE RATE AND LAGGED VARIABLES

Dependent Variable: CPI
Included observations: 39 after adjustments
Convergence achieved after 8 iterations

Variable	Coefficient	Std. Error	t-Statistic	Prob.
C	-428.7244	21.21859	-20.20513	0.0000
LNEX	47.45894	5.194420	9.136522	0.0000
LNM2	15.76220	2.177666	7.238113	0.0000
AR(1)	0.311882	0.158977	1.961804	0.0578

R-squared	0.977752	Mean dependent var	90.59400
Adjusted R-squared	0.975845	S.D. dependent var	24.24139
S.E. of regression	3.767585	Akaike info criterion	5.587660
Sum squared resid	496.8143	Schwarz criterion	5.758282
Log likelihood	-104.9594	F-statistic	512.7198
Durbin-Watson stat	1.843902	Prob(F-statistic)	0.000000

Inverted AR Roots	.31

APPENDIX D. BREUSCH-GODFREY SERIAL CORRELATION LM TEST:

Breusch-Godfrey Serial Correlation LM Test:

F-statistic	2.762166	Probability	0.105202
Obs*R-squared	2.850373	Probability	0.091353

Test Equation:
Dependent Variable: RESID
Method: Least Squares
Date: 10/27/05 Time: 01:17
Presample missing value lagged residuals set to zero.

Variable	Coefficient	Std. Error	t-Statistic	Prob.
C	-0.149262	13.19144	-0.011315	0.9910
LNEX	-0.263957	3.410174	-0.077403	0.9387
LNM2	0.158225	1.573894	0.100531	0.9205
RESID(-1)	0.268945	0.161823	1.661977	0.1052

R-squared	0.071259	Mean dependent var	-2.61E-14
Adjusted R-squared	-0.006136	S.D. dependent var	3.833698
S.E. of regression	3.845441	Akaike info criterion	5.626293
Sum squared resid	532.3470	Schwarz criterion	5.795181
Log likelihood	-108.5259	F-statistic	0.920722
Durbin-Watson stat	1.747572	Prob(F-statistic)	0.440629

APPENDIX F. WHITE GENERAL HETEROSKEDASTICITY TEST

White Heteroskedasticity Test:

F-statistic	0.815692	Probability	0.547174
Obs*R-squared	4.289823	Probability	0.508487

Test Equation:
Dependent Variable: RESID^2
Method: Least Squares
Date: 10/24/05 Time: 19:26
Sample: 1995Q2 2004Q4
Included observations: 39

Variable	Coefficient	Std. Error	t-Statistic	Prob.
C	4073.239	6137.111	0.663706	0.5115
LNEX	-297.5633	726.8197	-0.409405	0.6849
LNEX^2	-106.8754	138.8841	-0.769530	0.4471
LNEX*LNM2	147.6774	175.6612	0.840694	0.4066
LNM2	-507.0660	750.9706	-0.675214	0.5042
LNM2^2	-21.23811	23.76528	-0.893661	0.3780

R-squared	0.109995	Mean dependent var	12.73883
Adjusted R-squared	-0.024854	S.D. dependent var	15.54712
S.E. of regression	15.73914	Akaike info criterion	8.490816
Sum squared resid	8174.775	Schwarz criterion	8.746749
Log likelihood	-159.5709	F-statistic	0.815692
Durbin-Watson stat	2.184695	Prob(F-statistic)	0.547174

APPENDIX H. TESTING THE OVERALL SIGNIFICANCE OF THE MULTIPLE REGRESSION USING F TEST

Dependent Variable: CPI
Included observations: 39 after adjustments

Variable	Coefficient	Std. Error	t-Statistic	Prob.
C	-428.7613	21.22790	-20.19801	0.0000
LOG(M2)	15.70321	2.173094	7.226200	0.0000
LOG(EX)	47.56845	5.187411	9.169978	0.0000
AR(1)	0.311542	0.159050	1.958765	0.0581

R-squared	0.977690	Mean dependent var		90.59333
Adjusted R-squared	0.975777	S.D. dependent var		24.24174
S.E. of regression	3.772892	Akaike info criterion		5.590475
Sum squared resid	498.2149	Schwarz criterion		5.761097
Log likelihood	-105.0143	F-statistic		511.2607
Durbin-Watson stat	1.843954	Prob(F-statistic)		0.000000

Inverted AR Roots	.31

APPENDIX G. RAMSEY'S RESET TEST

Dependent Variable: CPI
Method: Least Squares
Date: 10/26/05 Time: 00:43
Sample (adjusted): 1995Q2 2004Q4
Included observations: 39 after adjustments
Convergence achieved after 12 iterations

Variable	Coefficient	Std. Error	t-Statistic	Prob.
C	-278.4595	93.28704	-2.984975	0.0052
LNEX	-4.407467	31.86888	-0.138300	0.8908
LNM2	8.725927	4.562112	1.912694	0.0642
LNCPI1	32.52046	19.53118	1.665054	0.1051
AR(1)	0.267538	0.167648	1.595831	0.1198

R-squared	0.979413	Mean dependent var	90.59400
Adjusted R-squared	0.976991	S.D. dependent var	24.24139
S.E. of regression	3.677094	Akaike info criterion	5.561332
Sum squared resid	459.7147	Schwarz criterion	5.774609
Log likelihood	-103.4460	F-statistic	404.3852
Durbin-Watson stat	1.753358	Prob(F-statistic)	0.000000

Inverted AR Roots	.27	

APPENDIX K. INCREMENTAL VARIABLE TEST

Dependent Variable: CPI
Included observations: 39 after adjustments
Convergence achieved after 12 iterations

Variable	Coefficient	Std. Error	t-Statistic	Prob.
C	-453.1666	51.72192	-8.761596	0.0000
LNM2	16.02228	2.276099	7.039360	0.0000
LNINT	1.065210	1.947080	0.547080	0.5879
LNEX	50.08062	7.728773	6.479763	0.0000
AR(1)	0.335601	0.159987	2.097677	0.0434

R-squared	0.977935	Mean dependent var		90.59400
Adjusted R-squared	0.975339	S.D. dependent var		24.24139
S.E. of regression	3.806830	Akaike info criterion		5.630680
Sum squared resid	492.7265	Schwarz criterion		5.843957
Log likelihood	-104.7983	F-statistic		376.7226
Durbin-Watson stat	1.826516	Prob(F-statistic)		0.000000

Inverted AR Roots	.34	

REFERENCES

Dwyer, P., Hafer, R. W., 1999. Are money growth and Inflation related?

Fujiki, H., 3/1998. Japanese money demand: Evidence from regional monthly data

Gujarati, N. D, 2004. Basic Econometrics, Fourth edition- Textbook.

Hallwood, C. P, MacDonald, R., 2004. International Money and Finance. Third edition.

Mankiw, G., 2003. Macroeconomics-Textbook.

Torsten, S., 9/200. Can Monetary Policy Be Effective During Transition?- Lessons from Mongolia

Rolnick, J., Weber, E., 1996. Money, Inflation, and Output Under Fiat and Commodity Standards.

Siliverstovs, B., Bilan, O., 04/2005. Modeling Inflation Dynamics in Transition Economies: The Case of Ukraine