

## A Survey of Recent Empirical Money Demand Studies

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*This paper surveys a selected number of studies that evaluated the demand for money using the error-correction model approach in the 1990s across a range of industrial and developing countries. It briefly presents issues relevant to modeling and estimating the demand for money; and synthesizes information concerning variables, data period and frequency, unit root and cointegration techniques, stability tests, and findings in a tabular form. In addition, it presents estimated long-run income elasticity and elasticities or semi-elasticities for opportunity cost and other variables in a comparable framework. It aims to provide a reference tool for future research on demand for money in various countries. [JEL E41]*

**D**emand for money plays a major role in macroeconomic analysis, especially in selecting appropriate monetary policy actions. Consequently, a steady stream of theoretical and empirical research has been carried out worldwide over the past several decades. The interest has, however, heightened in recent years, triggered primarily by the concern among central banks and researchers on the impact of the movement toward flexible exchange rate regime, globalization of capital markets, ongoing domestic financial liberalization and innovation, advancement in time series econometrics, and country-specific issues.

The extensive literature underscores two major points relevant to modeling and estimating the demand for money: variable selection and representation, and

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framework chosen. Failure to provide due consideration to these issues has tended to yield poor results. For the former, proper specification of opportunity cost variables happens to be the most important factor in getting meaningful results. Regarding the latter, the chosen system should be free of theoretical and estimation problems, and should perform well in empirical testing. The error-correction models (ECMs) have shown to meet these criteria.

This paper surveys a selected number of papers that applied the ECM approach to analyze the demand for money (of various definitions) during the 1990s in several industrial and developing countries.<sup>1</sup> The objective is to extract relevant information from these studies and provide it in a readily useable and comparable framework. In specific, the paper presents details concerning the techniques followed, variables chosen, periods and frequency selected, and major findings. In addition, it summarizes the long-run income elasticities, interest-rate semi-elasticities (or elasticities), and the coefficients of other relevant variables. It is hoped that the materials presented in this paper provide some reference points concerning the behavior of money demand in various countries, which in turn will help the policy makers in designing appropriate monetary policy actions and the researchers in carrying out further research.<sup>2</sup>

The paper is organized as follows: Section I briefly specifies the general framework that usually underlies the empirical formulation in estimating the demand for money. Section II carries out relevant discussion regarding the variables and estimation techniques, and summarizes information concerning various studies including the findings and estimated coefficients. Finally, Section III presents the conclusions.

## I. General Framework

There is a diverse spectrum of money demand theories emphasizing the transactions, speculative, precautionary or utility considerations.<sup>3</sup> These theories implicitly address a broad range of hypotheses. One significant aspect, however, is that they share common important elements (variables) among almost all of them. In general, they bring forth relationship between the quantity of money demanded and a set of few important economic variables linking money to the real sector of the economy (see Judd and Scadding, 1982, p. 993). What sets apart among these theories is that although they consider similar variables to explain the demand for money, they frequently differ in the specific role assigned to each. Consequently one consensus that emerges from the literature is that the empirical work is motivated by a blend of theories.

The general specification begins with the following functional relationship for the long-term demand for money:

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<sup>1</sup>This paper is based on Sriram (1999b, 1999c, and 2000). There have been other survey papers (for example, Judd and Scadding, 1982; Goldfeld and Sichel, 1990; Boughton, 1992; Laidler, 1993); but none of them focused exclusively on ECMs and covering a wide range of both industrial and developing countries.

<sup>2</sup>Refer to Ericsson (1998) for general issues concerning the empirical modeling of money demand.

<sup>3</sup>See, Laidler (1993) and Sriram (1999c), among others, for a survey of these approaches.

$$\frac{M}{P} = f(S, OC) \quad (1)$$

where the demand for real balances  $M/P$  is a function of the chosen scale variable ( $S$ ) to represent the economic activity and the opportunity cost of holding money ( $OC$ ).  $M$  stands for the selected monetary aggregate in nominal term and  $P$  for the price. Like in theoretical models, the empirical models generally specify the money demand as a function of real balances (see Laidler, 1993).<sup>4</sup>

## II. Discussion on Variables and Estimation Techniques

Given the above general framework, this section provides a brief overview of issues concerning selection and representation of variables, modeling, and estimation. Sriram (1999c) presents detailed account of these issues, including relevant references justifying various approaches undertaken by the researchers. The literature shows that money demand has been estimated for various aggregates, their components, or certain combination of these components. As definitions of money differ across countries (see Boughton, 1992, and Kumah, 1989), measures considered, including divisia aggregates, also varied across studies. Scale variable is used in the estimation as a measure of transactions relating to the economic activity. It is usually represented by variables expressing income, expenditure, or wealth concept (although a host of other variables is discussed in the literature). The price variable is selected to follow closely the chosen scale variable, although consumer price index is the most commonly used measure.

One of the most important aspects of modeling the demand for money is the selection of appropriate opportunity cost variables. The literature has shown that studies which paid inadequate attention on this matter produced poor results. There are two major ingredients: (i) own-rate and (ii) alternative return on money. The former happens to be very important, especially if the financial innovation has been taking place in an economy (see Ericsson, 1998). The latter involves yields on domestic financial and real assets for a closed economy, and additionally on foreign assets for an open economy. A number of instruments are available to represent the yields on domestic financial assets. The yield on real assets is usually proxied by the expected inflation. And, on foreign assets by foreign interest rate or some form of exchange rate variable. Prior to selecting appropriate opportunity cost variables, careful attention should be paid on evaluating macroeconomic situation and developments in the financial system (including institutional details and the regulatory environment), and degree of openness of the economy.

The economic theory provides some guidance in reference to the relationship between demand for money and its arguments. As the scale variable represents the transactions or wealth effects, it is positively related to the demand for money. The

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<sup>4</sup>Using the real money balance as the dependent variable will also mean that price homogeneity is explicitly imposed into the model. Additionally, there are less severe econometric problems associated with using real rather than nominal balances as the dependent variable (see Boughton, 1981, and Johansen, 1992b). And, majority of the empirical work does find evidence for the demand being for *real* balances.

own-rate is expected to be positively related as higher the return on money, less the incentive to hold assets alternative for money. Conversely, higher the returns on alternative assets, lower the incentive to hold money, and hence, the coefficients of alternative returns expected to be negative. The expected inflation generally affects the demand for money negatively as agents prefer to hold real assets as hedges during the periods of rising inflation. The foreign interest rates are expected to exert negative influence as increase in foreign interest rates potentially induce the domestic residents to increase their holdings of foreign assets which will be financed by drawing down domestic money holdings. Similarly, the expected exchange depreciation will also have a negative relationship. An increase in expected depreciation implies that the expected returns from holding foreign money increases, and hence, agents would substitute the domestic currency for foreign currency.<sup>5</sup>

The economic theory does not provide any rationale as to the correct mathematical form of the money demand function. There is consensus, however, that the log-linear version is the most appropriate functional form (see Zarembka, 1968). While money and scale variables typically enter in logarithms, interest rate variables appear either in levels or in logarithms. Consequently, estimates of the coefficient for the scale variable directly provides the measure of income elasticity, and those of interest rates show either elasticities or semi-elasticities depending on the way they are introduced in the formulation.

The partial adjustment framework was extremely popular in the 1970s. However, it was shown to suffer from specification problem and highly restrictive dynamics (see, for example, Cooley and LeRoy, 1981; Goodfriend, 1985; Hendry, 1979 and 1985; Hendry and Mizon, 1978). To counter these problems, two major solutions were proposed—modifying the theoretical base and improving the dynamic structure. The former led to buffer-stock models (BSMs), which were built upon the theory of precautionary demand for money (see, for example, Laidler, 1984; Cuthbertson and Taylor, 1987; Milbourne, 1988), and the latter to ECMs.<sup>6</sup> The BSMs also ran into criticism, especially in their relevance in the empirical estimation (see Milbourne, 1988). Meanwhile, ECMs seem to be promising. An important aspect of these models is that the data characteristics are thoroughly examined before selecting the appropriate estimation techniques. Furthermore, lag structures are selected based on the data generating process of the economic variables and not on *a priori* based on the economic theory or naive dynamic theory.

The ECM is shown to contain information on both the short- and long-run properties of the model with disequilibrium as a process of adjustment to the long-run equilibrium. Granger (1983 and 1986) has demonstrated that the concept of stable long-run equilibrium is the statistical equivalence of cointegration. When cointegration holds and if there is any shock that causes disequilibrium, there exists a well-defined short-term dynamic adjustment process such as the error-

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<sup>5</sup>Refer to Jusoh (1987) and Tan (1997) for reasons to expect positive relationship for expected inflation and expected exchange rate depreciation with the demand for real money respectively.

<sup>6</sup>In fact, Hendry, Pagan, and Sargan (1984) showed that PAMs and BSMs form the special cases of ECMs.

correction mechanism that will push back the system toward the long-run equilibrium. In fact, cointegration does imply the existence of a dynamic error-correction form relating to variables in question (see Engle and Granger, 1987). The major advantage of the error-correction modeling is that the economic theory is allowed to specify the long-run equilibrium while the short-run dynamics be defined from the data.

The earlier ECMs on money demand tended to be based on the single equation cointegrating relationship between money and the chosen scale variables as developed by Engle and Granger (1987). However, further research suggested that multivariate cointegrating vectors encompassing a broader number of variables provided a fuller characterization of the long-run determinants of demand. The specification of such multiple cointegrating vectors between nonstationary variables primarily employs the procedures developed by Johansen (1988) and Johansen and Juselius (1990) which make the original Engle-Granger framework a special case. However, as can be seen from Table 1, a number of other measures available to conduct the cointegration analysis.<sup>7</sup>

Table 1 also presents details relevant to modeling and estimating the demand for money from various studies. In specific, it summarizes information for a cross-section of developing and industrial countries, on monetary aggregates (nominal or real), scale variable(s), and the opportunity cost and other variables included; data period and frequency chosen; unit root, cointegration, and stability tests applied; nature of various time series (such as the order of integration and whether seasonally adjusted or not). It also presents the findings. The presentation of information will enable the researchers to draw some insights into the justification of selecting diverse set of variables and approaches across various countries.

Table 2 summarizes the long-run income elasticities and the semi-elasticities or elasticities of opportunity cost and other variables from those studies listed in Table 1. As the short-run dynamics can be potentially complicated, the table concentrates only on the long-run results. In order to promote comparability, the results are shown only for those studies which reported the long-term relationship (existence of cointegration). If more than one cointegration relationship is found, results are reported only for the preferred cointegration vector(s) as identified by the author(s), which not only meet a battery of statistical tests but also economically make sense with correct signs of the variables and meaningful size of coefficients.

Figures 1–3 show the distribution of income elasticities for real money as presented in Table 2 for components of narrow money, narrow money, and broad money respectively. The relevant descriptive statistics is shown in Table 3. It is clear from the table, the medians for all three groups are closer to one than to 0.5 thereby indicating that money does not play the role of transaction measure alone. There is no clear guidance from the theory or empirical studies regarding the acceptable magnitude on elasticities or semi-elasticities of the opportunity cost variables. The most relevant information will be the signs of the coefficients—positive for own-rate and negative for alternative return on money and expected

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<sup>7</sup>Refer to Sriram (1999c) for a longer list of studies that applied the ECM framework to analyze the demand for money in the past two decades.

Table 1. Summary of Demand for Money Studies Involving Cointegration/Error-Correction Modeling in Selected Industrial and Developing Countries

Country/ Author(s)	Sample Period/ Frequency	Determinants				Unit Root Test(s)	Order of Integration	Cointegration Technique(s)/ Test(s)	Stability Test(s)	Error- Correction Model (ECM)	Findings
		Monetary Aggregate(s)	Scale variable(s)	Interest rate(s)	Other(s)						
<b>Industrial countries</b>											
<i>Australia</i>											
Lim (1993)	1977:4-1990:2 Quarterly	Real currency; <sup>1</sup> real bank deposits; <sup>1</sup> real nonbank deposits <sup>1</sup> [GDPD-based]	Real GDP <sup>1</sup>	90-day bank bill rate; 2- and 5- year T-bond rate	Inflation rate (GDPD- based); structural dummy	ADF; P (1987)	90-day bank bill rate is I(0); others are I(1)	PH (1990) "fully modified" "regression"; JI (1990); PO (1990)	...	Yes	Cointegrating relationships exist for both monthly and quarterly models for each money variable (without the 90-day bank bill rate); ECM shows some evidence for the significance of the 90-day bank bill rate in influencing the short-run of the monetary aggregates.
<i>Canada</i>											
Haug and Lucas (1996)	1953:1-1990:4 1968:1-1990:4 Quarterly	In (real M1); <sup>1</sup> In (real M2); <sup>1</sup> In (real M2+) <sup>1</sup> [GDPD-based]	In (real GDP) [GDPD- based]	In (91-day T-bill rate); In (10-year T-bond rate)	...	DF	I(1)	AEG; DOLS; JI (1990); PO (1990)	Hansen (1992)	No	Results vary depending on the cointegration tests selected and the combination of money and interest rates; however, stable long-term relationship is found among real M1, real GDP, and the 91-day T-bill rate.
<i>Germany</i>											
Deutsche Bundesbank (1995)	1970:1-1994:4 Quarterly	Log (M3/ GNPD) [M3 is adjusted for statistical breaks]	Log (real GNP) [GNPD-based]	Yield on domestic bearer debt securities outstanding ( $r$ ); $r-1t^2$	Seasonal dummies	ADF	I(1)	EG (1987)	...	Yes	Cointegrating relationship exists among money, interest rate $r$ , and real GNP. The EC term is calculated as the avg. of previous four quarters, and has the negative coefficient which is significant.

Table 1. (continued)

Country/ Author(s)	Sample Period/ Frequency	Determinants			Unit Root Test(s)	Order of Integration	Cointegration Technique(s)/ Test(s)	Stability Test(s)	Error- Correction Model (ECM)	Findings
		Monetary Aggregate(s)	Scale variable(s)	Interest rate(s)						
<i>Greece</i> Ericsson and Sharma (1998)	1976:2-1994:4 Quarterly	In (M3/CPI)	In (GDP at factor cost in constant 1970 prices)	Net return on TD; interest rate spreads for repos and deposits; <sup>3</sup> LIBOR	ADF	I(1)	EG (1987); J (1988); J (1991a); J (1992a); J (1992b)	Chow	Yes [General to Specific Approach]	Cointegrating relationship among money, scale variable, inflation rate, and domestic interest rates and the spreads; stable ECM.
<i>Italy</i> Muscatelli and Papa (1990)	1963:1- 1987:4 Quarterly	Log (M2/ GDP) <sup>1</sup>	Log (real GDP) <sup>1</sup>	R = alternative return on M2 minus own- rate <sup>4</sup>	ADF; PO (1990); PP (1988)	I(1)	EG (1987)	Chow	Yes [General to Specific Approach]	Cointegration relationship can be obtained only after the addition of learning curve variables. Demand for M2 is significantly affected by the introduction of new financial instruments.
<i>Japan</i> Arize and Shwiff (1993)	1973:1- 1988:4 Quarterly	In (real M2) <sup>1</sup>	In (real GNP) <sup>1</sup> In (real wealth) <sup>1</sup>	In (1+R) <sup>6</sup> In (real XR) <sup>1</sup> ; inflation rate; <sup>1</sup> In (IGNPD) <sup>1</sup>	DF; ADF; PP (1988)	I(1)	AEG	Ashley (1984); Chow; CUSUM; CUSUMSQ	Yes	Cointegrating relationship among real GNP, real wealth, and real XR; stable ECM throughout the sample period.
<i>New Zealand</i> Orden and Fisher (1993)	1965:2-1989:4 1965:2-1984:2 Quarterly	Log (M3)	Log (real GDP)	Annual rate on S-T trading bank loans	DF	I(1)	J (1988); JJ (1990)	...	No	Cointegration without interest rate for the sub sample; and with interest rate for full sample.

Table 1. (continued)

Country/ Author(s)	Sample Period/ Frequency	Monetary Aggregate(s)	Determinants			Unit Root Test(s)	Order of Integration	Cointegration Technique(s)/ Test(s)	Stability Test(s)	Error- Correction Model (ECM)	Findings
			Scale variable(s)	Interest rate(s)	Other(s)						
<i>Norway</i> Bårdsen (1992)	1967:3-1989:4 Quarterly	ln (NM)	ln (real GDE)	Interest rate on DD and TD; yield on long-term private bond; 3-month euro-krone rate	ln (GDED)	not explicitly shown	I(1) except for 3-month euro-krone rate (which may be stationary around a trend)	J (1988); JI (1990)	Chow	Yes	At least two and possibly up to five cointegration vectors exist; money is endogenously determined by prices, real expenditure, and interest rates.
<i>Switzerland</i> Chowdhury (1995)	1973:2- 1991:4 Quarterly	Log (real B) Log (real M1)	Log (real GDP)	S-T (3-month TDR on Euro deposits in Swiss francs); L-T (return on federal bonds)	NEER; London clearing banks rate	ADF; KPSS (1992); PP (1988)	I(1)	J (1988); JI (1990)	Chow	No	Demonstrates the importance of including variables expressing foreign influence in an open economy; without adding exchange rate no cointegration is found.
<i>United Kingdom</i> Drake and Chrystal (1994)	1976:2-1990:3 Quarterly	ln (M1d); ln (M2d); ln (M3d) where d stands for divisia aggregates	ln (real GDP)	Benchmark rate of interest; own rates of interest on M2d and M3d	ln (GDPP); inflation (GDPP-; based); implicit divisia rental price or user cost indices for M1d, M2d, and M3d; dummy variable	DF; ADF; PP (1988)	I(1) except for implicit divisia rental price or user cost indices for M2d and M3d which are I(0)	J (1988); JI (1990)	Chow; CUSUM; CUSUMSQ	Yes [General to Specific Approach]	Company sector money demand; cointegrating relationship exists for all monetary aggregates. ECMs indicate that the speed of adjustment of the EC term is faster for M1d than for M2d and M3d.



Table 1. (continued)

Country/ Author(s)	Sample Period/ Frequency	Determinants				Unit Root Test(s)	Order of Integration	Cointegration Technique(s)/ Test(s)	Stability Test(s)	Error- Correction Model (ECM)	Findings
		Monetary Aggregate(s)	Scale variable(s)	Interest rate(s)	Other(s)						
<i>United States</i> Miller (1991)	1959:1-1987:4 Quarterly	ln (adjusted B); ln (M1); ln (M1A); ln (M2); ln (M3)	ln (real GNP)	ln (4-6 month CPR); ln (dividend- price ratio)	ln (IPD)	DF; ADF	I(1)	EG; AEG	...	Yes	Cointegration relationship exists among M2, real GNP, IPD, and the CPR, ECM for M2 suggests valid and significant error-correction term.
Baba, Hendry, and Starr (1992)	1960:3-1988:3 Quarterly	ln (M1/ IGNPD) <sup>1</sup>	ln (real GNP) <sup>1</sup>	Yields on 20- year T-bond and on one- month T-bill checkable rate in M1; measure of volatility on long bond; credit control dummy	Learning adjusted yield on instruments in M2 and other checkable rate in M1; measure of volatility on long bond; credit control dummy	J (1988)	I(1)	J (1988); JJ (1990)	Chow	Yes [General to Specific Approach]	Stable cointegrating demand function for real M1 (with the arguments which include inflation, real income, long-term bond yield and risk, T-bill interest rate, and learning curve weighted yields on newly introduced instruments in M1 and non-transactions M2).
McNown and Wallace (1992)	1973:2-1988:4 Quarterly	Log (real M1); Log (real M2)	Log (real GNP)	Nominal T-bill rate	Log (NEER)	ADF	I(1)	J (1988); JJ (1990)	...	No	Cointegrating relationship for M1 (but not for M2) with real GNP and T-bill rate. Adding NEER to the M2 equation establishes the cointegrating relationship.
Mehra (1993)	1953:1-1991:2 Quarterly	ln (M2/IGNPD)	ln (real GNP)	ln (R-RM2) <sup>7</sup>	...	ADF	Interest rate is I(0); others I(1)	OLS; IVT	Chow	Yes [OLS and IVT]	Example of a model that estimates both the long- and short-run coefficients in one step.
											Cointegrating relationship for real M2 and real GNP; money demand function is stable throughout the sample period.

Table 1. (continued)

Country/ Author(s)	Sample Period/ Frequency	Determinants			Unit Root Test(s)	Order of Integration	Cointegration Technique(s)/ Test(s)	Stability Test(s)	Error- Correction Model (ECM)	Findings	
		Monetary Aggregate(s)	Scale variable(s)	Interest rate(s)							Other(s)
<b>Developing countries</b>											
<i>Argentina</i>											
Choudhry (1995)	1935:1-1962:4 1946:1-1962:4 Quarterly	In (M1/WPI); In (M2/WPI)	In (real NNI)	...	Inflation rate [WPI-based]	ADF	I(1)	J (1988); JJ (1990)	...	Yes	Cointegration relationship exists among real money (M1 and M2), real NNI, and the inflation rate. ECM finds relationship real money and inflation.
between											
<i>Bolivia</i>											
Asilis, Honohan, and McNelis (1993)	1980:9-1988:12 Monthly	In (B/CPI); In (M1/CPI); In (M2/CPI)	...	...	Expected inflation; inflation uncertainty	ADF	I(1)	J (1988); JJ (1990)	...	Yes	The null hypothesis of at least one cointegrating vector is not rejected. ECM contains time- varying EC term, estimated by Kalman filtering technique.
<i>Cameroon</i>											
Fielding (1994)	1976:1-1987:2 Quarterly	In (BM/CPI)	In (real GDP adjusted for terms of trade)	In (1+CBDR)	In (1+ $\pi$ ); mavart; quarterly dummy variables <sup>s</sup>	DF; Hylleberg and others (1990)	I(1)	JJ (1990)	Chow [for ECM]	Yes	Three cointegrating relationships among real BM, real GDP, inflation, interest rate and mavart. ECM passes diagnostic tests; EC term has a nearly unit coefficient.
<i>China</i>											
Hafer and Kutan (1994)	1952-88 Annual	Log (currency); Log (currency plus SD)	Log (NI/RPI); Log (NI/NID)	Log (one-year interest rate on SD)		DF	I(1)	J (1988); JJ (1990)	...	...	Cointegrating relationship exists only when NID (and not RPI) is used as a price variable; plus SD is the preferred measure of the monetary aggregate.
currency											

Table 1. (continued)

Country/ Author(s)	Sample Period/ Frequency	Determinants			Unit Root Test(s)	Order of Integration	Cointegration Technique(s)/ Test(s)	Stability Test(s)	Error- Correction Model (ECM)	Findings
		Monetary Aggregate(s)	Scale variable(s)	Interest rate(s)						
Tseng and others (1994)	1983:1-1988:4 1989:1-1993:4 Quarterly	In (CC/RPI); <sup>1</sup> In (M1/RPI); <sup>1</sup> In (M2/RPI) <sup>1</sup>	In (real NI) <sup>1</sup>	Real interest rate for the M1 and M2 equations for 1989:1- 1993:4 <sup>9</sup>	Quarterly inflation rate (RPI-based) [for 1983:1- 1988:4]	ADF	I(1)	EG; J (1988); JJ (1990)	Chow	Yes All monetary aggregates are sensitive to inflation although its impact drops during the 1989:1-1993:4 subperiod. Interest rates exert significant influence on M1 and M2 in the 1989:1-1993:4 subperiod.
<i>Côte d'Ivoire</i> Fielding (1994)	1974:3-1987:4 Quarterly	In (BM/CPI)	In (real GDP adjusted for terms of trade)	In (1+CBDR)	In (1+ $\pi$ ); mavart; quarterly dummy variables <sup>8</sup>	DF; Hylleberg and others (1990)	I(1)	JJ (1990)	Chow	Yes At least two cointegrating vectors among real money, real GDP, inflation, interest rate, and mavart. The error-correction coefficient is calculated from the residuals of the first two cointegrating vectors. Very slow adjustment to long-run equilibrium.
<i>India</i> Moosa (1992)	1972:1-1990:4 Quarterly	Log (CC/CPI); Log (NM/CPI); Log (BM (NM plus QM)/CPI)	Log (IO)	Log (MMR; rate offered in Bombay interbank market)	...	DF; ADF	I(1)	EG; AEG; CRDW; J (1988); JJ (1990)	...	Yes Cointegration relationship exists for real money (except for BM using AEG) with IO and MMR. More stable relationship for CC and NM than for BM. ECMs show better results for CC and NM than for BM.

Table 1. (continued)

Country/ Author(s)	Sample Period/ Frequency	Determinants			Unit Root Test(s)	Order of Integration	Cointegration Technique(s)/ Test(s)	Stability Test(s)	Error- Correction Model (ECM)	Findings
		Monetary Aggregate(s)	Scale variable(s)	Interest rate(s)						
<i>Indonesia</i> Price and Insukindro (1994)	1969:1-1987:4 Quarterly	In (real CHP); In (real DD)	In (real GDP)	Rate of return on TD and on SD; LIBOR	Dummy variable for 1983 [for ECM]	DF; ADF	I(1)	EG; J (1988)	Chow; Salkever (1976) dummy approach [for ECM]	Yes  EG: weak evidence of cointegration relationship for currency; J (1988) finds up to 2 cointegrating vectors for both money equations. ECM does not find LIBOR being an important variable.
Dekle and Pradhan (1997)	1974-95 Annual	Log (NM); Log (BM); Log (real NM); Log (real BM)	Log (real GDP)	TDR [for NM]; MMR- TDR weighted by the share of QM in BM;	Log (CPI)	ADF	I(1) except for Log (CPI) which is I(0)	J (1988); JJ (1990)	...	No  No cointegrating relationship for any definition of money.
<i>Iran</i> Bahmani- Oskoee (1996)	1959-90 Annual	Log (M1/GDPD); Log (M2/GDPD) 1980 prices)	Log (GDP in 1980 prices)	Inflation; Log (official XR); Log (black market XR)		ADF; Perron (1989)	I(1)	J (1988); JJ (1990)	...	No  The most suitable model is the one that applies the black market XR with real GDP and inflation to explain demand for real M2.
<i>Kenya</i> Adam among	1973:1-1989:2 Quarterly	Log (M0/CPI); Log (M1/CPI); Log (M2/CPI); Log (M3/CPI); Log (M3d/CPI) where M3d is divisia M3	Log (GNY/ CPI) where GNY is GNP adjusted for changes in terms of trade	In (1+r) where r = quarterly yield on T-bill	Expected DEPR using parallel market XR; inflation; seasonal dummies	DF; ADF; CRDW	I(1)	J (1988); JJ (1990)	...	Yes  Two cointegrating vectors  5 variables for each monetary aggregate. ECMs validate the cointegrating relationships.

Table 1. (continued)

Country/ Author(s)	Sample Period/ Frequency	Monetary Aggregate(s)	Determinants			Unit Root Test(s)	Order of Integration	Cointegration Technique(s)/ Test(s)	Stability Test(s)	Error- Correction Model (ECM)	Findings
			Scale variable(s)	Interest rate(s)	Other(s)						
Fielding (1994)	1975:2-1989:2 Quarterly	ln (BM/CPI)	ln (real GDP adjusted for terms of trade)	ln (1+ $\pi$ )-bill rate)	ln (1+ $\pi$ ); ln (1+DEPR) using parallel market XR; mavart; mavart; quarterly dummy variables <sup>8</sup>	DF; Hylleberg and others (1990)	I(0) for ln (1+DEPR); I(1) for others	JJ (1990)	Chow [for ECM]	Yes	Three cointegrating relationships among real money, real GDP, inflation, interest rate, mavart, and mavart. The EC term is calculated based on the residuals from the first two cointegrating vectors. S-T elasticities are smaller than those of long run.
<i>Korea</i> Arize (1994) (both	1973:1-1990:1 Quarterly	ln (M1/CPI); ln (M2/CPI)	ln (real GDP)	CBR; interest rate on loans and TD on NCB; weighed avg. of S-T interest rates in 9 industrial countries; uncovered interest rate differential in favor of foreign country	Expected rate of inflation; EER; standard deviation of the change in the log of the EER; dummy variable to measure the change in circumstances	ADF; Hylleberg and others (1990); Osborn (1990); Hasza and Fuller (1982); Perron (1988)	I(1)	EY (1987); J (1988); JJ (1990)	Chow	Yes	Two to three cointegrating vectors among real money, M1 and M2), real income, interest rate, and foreign exchange rate risk and return. Well-specified ECM.
<i>Lebanon</i> Eken and others (1995)	1964-93 Annual	Log (B/CPI); Log (M1/CPI); Log FCD\$; <sup>10</sup> Log (M2LL /CPI); <sup>10</sup>	Log (real GDP); Log (U.S. dollar- denominated GDP)	...	Log (CPI); Log (U.S. CPI); expected inflation; war year dummy	PP (1988)	I(1)	EG (1987); PO (1990)	...	...	Cointegrating relationship exists between various definitions of money and with real GDP, prices, and domestic inflation.

Table 1. (continued)

Country/ Author(s)	Sample Period/ Frequency	Determinants				Unit Root Test(s)	Order of Integration	Cointegration Technique(s)/ Test(s)	Stability Test(s)	Error- Correction Model (ECM)	Findings
		Monetary Aggregate(s)	Scale variable(s)	Interest rate(s)	Other(s)						
<i>Malaysia</i> Sriram (1999a)	1973:8- 1995:12 Monthly	ln (M2/CPI)	ln (IIP)	CB/TD3M; discount rate on 3-month T-bills	Expected inflation; nominal XR; seasonal and structural dummies	DF; ADF	ln (IIP) and expected inflation are I(0); others are I(1)	J (1988); JJ (1990)	Chow	Yes [General to specific Approach]	Cointegration relationship exists between real M2 and its determinants under both the closed- and open-economy framework; fairly stable ECMs under both situations.
<i>Mexico</i> Khamis and Leone (1999)	1983:1- 1997:6 Monthly	ln (CC/CPI)	ln (real private consumption expenditure)	60-day TDR	Inflation	ADF	I (1)	J (1988); JJ (1990)	Chow	Yes	Cointegration relationship among real CC, scale variable, and 60-day TDR; stable ECM.
<i>Morocco</i> Hoffman and Tahiri (1994)	1959:1-1988:2 Quarterly	Log (M1); Log (M2)	Log (GDP/ CPI); Log (GNP/ CPI)	Swiss S-T interest rate; interest rate on TD	Log (CPI); seasonal dummies	ADF; KPSS (1992)	I(1) possibly about a deterministic trend; KPSS test fails to reject the null of stationary for Swiss S-T interest rate adjusted for TDR	J (1988); J (1991b); JJ (1990); OLS; DOLS	Hansen and Johansen (1993)	No	Single cointegrating vector among measures of nominal money, prices, real income, and Swiss S-T interest rate.
<i>Nigeria</i> Fielding (1994)	1976:1-1989:2 Quarterly	ln (BM/CPI)	ln (real GDP adjusted for terms of trade)	ln (1+T-bill rate)	ln (1+r); ln (1+DEPR) using parallel market XR; mavault; <sup>8</sup> seasonal dummies	DF; Hylleberg and others (1990)	I(0) for ln (1+DEPR); I(1) for others	JJ (1990)	Chow [for ECM]	Yes	One cointegrating relationship among real money, real GDP, inflation, interest rate and mavault.

Table 1. (continued)

Country/ Author(s)	Sample Period/ Frequency	Determinants			Unit Root Test(s)	Order of Integration	Cointegration Technique(s)/ Test(s)	Stability Test(s)	Error- Correction Model (ECM)	Findings
		Monetary Aggregate(s)	Scale variable(s)	Interest rate(s)						
Teriba (1997)	1960-94 Annual 1962:1-1995:2 for M1; and 1962:1-1992:4 for M2 Quarterly	Log (COB); Log (M1); Log (M2)	Log (real DA)	Log (interest rate for 12- month TD); Log (interest rate for 3- month TD)	DF	I(1) except for Log M1 (I(2)) and for parallel market XR (I(0))	EG; AEG	...	Yes	Cointegration relationship exists among the monetary aggregates, DA, DAD, and interest rates. Foreign opportunity cost variable has influence on M1 equation only.
<i>Pakistan</i> Arize (1994)	1973:1-1990:1 Quarterly	ln (M1/CPI); ln (M2/CPI)	ln (real GDP) [WPI-based]	CMR; Govt bond yield; weighted avg. of S-T interest rates in 9 industrial countries; uncovered interest rate differential in favor of foreign country	ADF; Hylleberg and others (1990); Osborn (1990); Hasza and Fuller (1982); Perron (1988)	I(1)	EY (1987); J (1988); JJ (1990)	Chow	Yes	Two to three cointegrating vectors exist among real money (both M1 and M2), real GDP, interest rate, and foreign exchange rate risk and return. Well-specified ECM.
Hossain (1994)	1951-91 1972-91 Annual	Log (M1/CPI); Log (M2/CPI)	ln (real GDP)	ln (yield on Govt. bonds); ln (market call rate of interest)	DF; ADF	Expected inflation is I(0); others I(1)	EG; AEG; CRDW; J (1988); JJ (1990)	...	No	EG, AEG, and CRDW tests show conflicting results. But JJ (1990) test finds 2 cointegrating among money, real GDP, and call rate of interest for 1972-91 and one for 1953-91. M1 is found to be more stable than M2.
vectors										

Table 1. (continued)

Country/ Author(s)	Sample Period/ Frequency	Determinants				Unit Root Test(s)	Order of Integration	Cointegration Technique(s)/ Test(s)	Stability Test(s)	Error- Correction Model (ECM)	Findings
		Monetary Aggregate(s)	Scale variable(s)	Interest rate(s)	Other(s)						
<i>Singapore</i> Arize (1994)	1973:1-1990:1 Quarterly	ln (M1/CPI); ln (M2/CPI)	ln (real GDP) [WPI-based]	CMR; 3- month FDR; weighed avg. of S-T interest rates in 9 industrial countries; uncovered interest rate differential in favor of foreign country	Expected rate of inflation; EER; standard deviation of the change in the log of the EER; dummy variable to measure the change in circumstances	ADF; Hylleberg and others (1990); Osborn (1990); Hasza and Fuller (1982); Perron (1988)	I(1) except for expected rate of inflation which is I(0)	EY (1987); J (1988); JJ (1990)	Chow	Yes	2-3 cointegrating vectors among real money (both M1 and M2), real GDP, interest rate, and foreign exchange rate risk and return. Well-specified ECM.
Dekle and Pradhan (1997)	1975-95 Annual	Log (NM); Log (BM); Log (real NM); Log (real BM)	Log (real GDP)	TDR [for NM]; MMR- TDR weighted by the share QM in BM; LIBOR	Log (CPI); expected depreciation rate	ADF	I(1)	J (1988); JJ (1990)	...	No	Cointegrating relationships for nominal NM and BM.
<i>Thailand</i> Dekle and Pradhan (1997)	1978-95 Annual	Log (NM); Log (BM); Log (real NM); Log (real BM)	Log (real GDP)	TDR [for NM]; MMR- TDR weighted by the share of QM in BM;	Log (CPI)	ADF	I(1)	J (1988); JJ (1990)	...	No	Cointegrating relationship for nominal NM only.



Table 1. (concluded)

Country/ Author(s)	Sample Period/ Frequency	Monetary Aggregate(s)	Scale variable(s)	Determinants			Error- Correction Model (ECM)	Findings
				Interest rate(s)	Other(s)	Order of Integration		
<i>Tunisia</i> Treichel (1997)	1963-95 Annual 1990-95 Monthly	In (M2/CPI); In (M4/CPI)	In (real GDP)	Monthly yield on T-bill; seasonal rediscunt rate; MMR	Inflation rate; seasonal dummies	ADF  I(1) except for inflation rate which is I(0)	Recursive Chow [for ECM]	Yes  Stable long-term relationship among real money, real GDP, and the monthly yield on T-bill. Stable ECM.

Note: The following abbreviations are used:  
**Monetary aggregates:** B = base money; BM = broad money; CHP = currency held by public; CC = currency in circulation; COB = currency outside banks; DD = demand deposits;  
**NM** = narrow money; QM = quasi-money; SD = savings deposits; and TD = time deposits.  
**Scale variable:** DA = domestic absorption; GDE = gross domestic expenditure; GDP = gross domestic product; GNP = gross national product; IIP = index of industrial production; IO = industrial output;  
**NI** = national income; and NNI = net national income.  
**Interest rate:** CMR = call money rate; CBR = commercial paper rate; CBR = corporate bond rate; FDR = fixed deposit rate; LIBOR = London interbank offered rate; LTBAR = Long-term borrowing rate; MMR = money market rate; CBTD3M = Three-month deposit rates at commercial banks; TDR = time deposit rate; T-bill = Treasury bill; and T-bond = Treasury bond.  
**Exchange rate:** DEPR = depreciation; XR = exchange rate; EER = effective exchange rate; and NEER = nominal effective exchange rate.  
**Prices:** CPI = consumer price index; RPI = retail price index; and WPI = wholesale price index.  
**Deflators:** DAD = domestic absorption deflator; GDED = gross domestic expenditure deflator; GDPPD = gross domestic product deflator; GNPD = gross national product deflator;  
**IGDPPD** = implicit GDP deflator; IGNDP = implicit GNP deflator; IPD = implicit price deflator; and NID = national income deflator.  
**Unit root tests:** ADF = augmented Dickey-Fuller; CRDW = cointegration regression Durbin-Watson; DF = Dickey-Fuller; J (1988) = Johansen (1988); KPSS = Kwiatkowski, Phillips, Schmidt, and Shin (1992); P (1987) = Phillips and Ouliaris (1990); and PP (1988) = Phillips and Perron (1988).  
**Cointegration tests:** AEG = augmented Engle and Granger; CRDW = cointegration regression Durbin-Watson; DOLS = dynamic ordinary least squares of Stock and Watson (1993); EG = Engle and Granger; EY = Engle and Yoo (1987); IVT = instrumental variable technique; J (n) = Johansen (n) where n stands for 1988, 1991a, 1991b, 1992a, 1992b respectively;  
**JJ (1990)** = Johansen and Juselius (1990); OLS = ordinary least squares; PH = Phillips and Hansen (1990); and PO (1990) = Phillips and Ouliaris (1990).  
**General:** avg. = average; CB = corporate bonds; EC = error-correction; Govt. = Government; NCB = nationwide commercial banks; L-T = long-term; and S-T = short-term.

<sup>1</sup>Seasonally adjusted.  
<sup>2</sup>Where 'it' stands for time deposit rate of deposits between DM 100,000 and DM 1 million.  
<sup>3</sup>Spreads between yield on T-bill and net return on time deposits and between yield on T-bill and net return on repurchase agreements respectively.  
<sup>4</sup>Own-rate is interest rate on bank deposits, net of taxes; and alternative return is yield on longer-term government debt.  
<sup>5</sup>BOT stands for Buoni Ordinari del Tesoro and CCT for Certificati di Credito del Tesoro.  
<sup>6</sup>R is defined as the three-month average Gensaki rate minus the average return on holding broad money defined as weighted average of the interest rate on three-month certificates of deposit and the guideline three-month deposit rate.  
<sup>7</sup>R = own rate of return for M2 (weighted average of explicit interest rates paid on the components of M2) minus RM2 (four-six month CPR).  
<sup>8</sup>mavarr is annual moving average of changes in inflation calculated as |ln(I+P)|, and mavarr is for interest rates.  
<sup>9</sup>Defined as one-year time deposit rate minus the rate of inflation.  
<sup>10</sup>FCD\$ and M2LL stand for U.S. dollar-denominated deposits and Lebanese pound component of M2 respectively.

Table 2. Coefficients of Long-Run Demand for Money Estimated Under ECM Framework in Selected Countries<sup>1</sup>

Study	Period/ Frequency	Method	Elasticity			Opportunity Cost (Semi-Elasticity) <sup>2</sup>					
			Money <sup>3</sup>	Real Income	Price Level	Own-Rate	Alternative Return	Interest Rate <sup>4</sup>	Inflation	Other	
<b>Industrial countries</b>											
Canada											
Haug and Lucas (1996)	1953:1– 1990:4 Quarterly	DOLS	<i>m1</i>	0.420						-0.033*	
Germany											
Deutsche Bundesbank (1995)	1970:1– 1994:4 Quarterly	EG (1987)	<i>m3</i>	1.400						-1.220	
Greece											
Ericsson and Sharma (1998)	1976:2– 1994:4 Quarterly	J (1988); JJ (1990)	<i>m3</i>	1.220			7.650 & 7.020		-10.090		-3.380
Italy											
Muscattelli and Papi (1990)	1963:1– 1987:4 Quarterly	EG (1987)	<i>m2</i>	1.367					-2.082		-0.352 <sup>5</sup>
Japan											
Arize and Shwiff (1993)	1973:1– 1988:4 Quarterly	AEG	<i>m2</i>	0.641 & 0.378 <sup>6</sup>							0.094 <sup>87</sup>
New Zealand											
Orden and Fisher (1993)	1965:2– 1989:4 Quarterly	J (1988); JJ (1990)	<i>M3</i> <i>M3</i>	0.410 0.630						-0.014 -0.001	

Table 2. (continued)

Study	Period/ Frequency	Method	Money <sup>3</sup>	Elasticity			Opportunity Cost (Semi-Elasticity) <sup>2</sup>			
				Real Income	Price Level	Own-Rate	Alternative Return	Interest Rate <sup>4</sup>	Inflation	Other
Norway Bårdsen (1992)	1967:3– 1989:4 Quarterly	J (1988); JJ (1990)	NM	1.374	0.810	6.553	-1.544 & -0.995			-0.097 <sup>8</sup>
Switzerland Chowdhury (1995)	1973:2– 1991:4 Quarterly	J (1988); JJ (1990)	<i>b</i> <i>mI</i> <i>b</i> <i>mI</i>	0.940 0.887 0.952 0.900			-0.260 -0.310 -0.110 -0.080			0.363 & -0.140 <sup>9</sup> 0.344 & -0.098 <sup>9</sup> 0.391 & -0.102 <sup>10</sup> 0.308 & -0.052 <sup>10</sup>
United Kingdom Drake and Chrystal (1994)	1976:2– 1990:3 Quarterly	J (1988); JJ (1990)	<i>MId</i> <i>MId</i> <i>M2d</i> <i>M3d</i>	3.223 3.372 2.560 2.576	1.041 0.815 1.208 1.190	0.775 1.087	-0.707 -0.769			-4.346 <sup>11</sup> -4.829 <sup>11</sup>
United States Miller (1991)	1959:1– 1987:4 Quarterly	EG (1987)	<i>M2</i>	1.204	0.952			-0.092*		
Baba, Hendry, and Starr (1992)	1960:3– 1988:3 Quarterly	J (1988)	<i>mI</i>	0.510				-6.640		-5.510 & 3.720 <sup>12</sup>
McNown and Wallace (1992)	1973:2– 1988:4 Quarterly	J (1988); JJ (1990)	<i>mI</i> <i>mI</i> <i>m2</i> <i>m2</i>	0.987 1.001 1.131 1.128				-2.828 -9.600 -1.745 -1.747		0.133 <sup>*7</sup> 0.131 <sup>*7</sup>

Table 2. (continued)

Study	Period/ Frequency	Method	Money <sup>3</sup>	Elasticity			Opportunity Cost (Semi-Elasticity) <sup>2</sup>				
				Real Income	Price Level	Own-Rate	Alternative Return	Interest Rate <sup>4</sup>	Inflation	Other	
Developing countries											
Argentina Choudhry (1995)	1935:1–	J (1988); JJ (1990)	<i>m1</i>	1.970						-0.025	
	1962:4 Quarterly		<i>m2</i>	1.680						-0.033	
	1946:1–		<i>m1</i>	1.910						-0.034	
	1962:4 Quarterly		<i>m2</i>	3.450						-0.041	
Cameroon Fielding (1994)	1977:1–	JJ (1990)	<i>m2</i>	1.490					-8.910*	-1.310*	-8.100 <sup>1,3</sup>
	1987:2 Quarterly										
China Tseng and others (1994)	1983:1–	EG (1987)	<i>cc</i>	1.900							-1.230
	1988:4		<i>m1</i>	1.530							-1.510
	Quarterly		<i>m2</i>	1.810							-2.210
	1989:1–		<i>m1</i>	1.480							-0.940
1993:4 Quarterly	<i>m2</i>	1.580					-0.050			-1.540	
Côte d'Ivoire Fielding (1994)	1975:3– 1987:4 Quarterly	JJ (1990)	<i>bm</i>	1.580					-3.040*	2.430*	-1.630 <sup>1,3</sup>

Table 2. (continued)

Study	Period/ Frequency	Method	Money <sup>3</sup>	Elasticity				Opportunity Cost (Semi-Elasticity) <sup>2</sup>							
				Real Income	Price Level	Own-Rate	Alternative Return	Interest Rate <sup>4</sup>	Inflation	Other					
India Moosa (1992)	1972:1– 1990:4 Quarterly	EG (1987)	<i>cc</i>	0.874											
			<i>nm</i>	0.785					-0.109*						
			<i>bm</i>	1.471					-0.032*						
Indonesia Price and Insukindro (1994)	1969:1– 1987:4 Quarterly	J (1988) JJ (1990)	<i>cc</i>	0.986											
			<i>nm</i>	0.797					-0.258*						
			<i>bm</i>	1.573					-0.277*						
Indonesia Price and Insukindro (1994)	1969:1– 1987:4 Quarterly	EG (1987)	<i>chp</i>	0.880									-2.100 <sup>s</sup>		
			<i>dd</i>	1.300					-1.500				-1.000 <sup>s</sup>		
			<i>chp</i> <i>dd</i>	0.710 1.100					-4.400 -8.400					-3.300 <sup>s</sup> -9.100 <sup>s</sup>	
Iran Bahmani– Oskooee (1996)	1959–90 Annual	J (1988); JJ (1990)	<i>m2</i>	1.390									0.250* <sup>7</sup>		
			<i>m2</i>	1.330							-1.370 -1.610		0.020* <sup>7</sup>		
Kenya Adam (1992)	1973:1– 1989:2 Quarterly	J (1988); JJ (1990)	<i>m0</i>	1.010										-6.150	
			<i>m1</i>	0.890										-5.460	
			<i>m2</i>	0.840											-6.730
			<i>m3</i> <i>m3d</i>	1.100 0.840											-6.190 -5.510
													0.520*		
													2.250*		
													18.140*		

Table 2. (continued)

Study	Period/ Frequency	Method	Money <sup>3</sup>	Elasticity			Opportunity Cost (Semi-Elasticity) <sup>2</sup>						
				Real Income	Price Level	Own-Rate	Alternative Return	Interest Rate <sup>4</sup>	Inflation	Other			
Korea Arize (1994)	1973:1– 1990:1 Quarterly	EY (1987)	m1	0.500					-0.027			-0.007 & -0.016 <sup>5</sup>	
				0.950							-1.220	-0.003 & -0.080 <sup>5</sup>	
				0.570						-0.034			-0.008 & -0.021 <sup>5</sup>
				1.160								-9.150	-0.017 & -0.090 <sup>5</sup>
Lebanon Eken and others (1995)	1964–93 Annual	EG (1987) PO (1990)	b	0.790								-1.200 -1.470 -1.310	
			m1	1.120									
			m2II	0.960									
Malaysia Sriram (1999a)	1973:8– 1995:12 Monthly	J (1988); JJ (1990)	m2	1.036								4.884 2.510	
			m2	1.130								-5.391 -1.834	
Mexico Khamis and Leone (1999)	1983:1– 1997:6 Monthly	J (1988); JJ (1990)	cc	0.450									
													-9.730

Table 2. (continued)

Study	Period/ Frequency	Method	Money <sup>3</sup>	Elasticity			Opportunity Cost (Semi-Elasticity) <sup>2</sup>			
				Real Income	Price Level	Own-Rate	Alternative Return	Interest Rate <sup>4</sup>	Inflation	Other
Morocco Hoffman and Tahiri (1994)	1959:1– 1988:2 Quarterly	OLS	<i>M1</i>	1.080	1.330		-0.050			-0.020 <sup>8</sup>
				1.120	1.290		-0.050			-0.030 <sup>8</sup>
		DOLS	<i>M2</i>	1.100	1.120					-0.010 <sup>16</sup>
				1.140	1.090					-0.020 <sup>16</sup>
		J (1991b)	<i>M1</i>	1.180	1.080		-0.025			-0.040 <sup>8</sup>
				1.200	1.050		-0.020			-0.040 <sup>8</sup>
			1.210	1.900					-0.030 <sup>16</sup>	
			1.230	0.900					-0.040 <sup>16</sup>	
Nigeria Fielding (1994)	1977:1– 1987:2 Quarterly	JJ (1990)	<i>M1</i>	1.120	0.940					-0.060 <sup>8</sup>
				1.100	0.970					-0.060 <sup>8</sup>
		EG (1987)	<i>M2</i>	1.180	0.860					-0.040 <sup>16</sup>
				1.170	0.870					-0.040 <sup>16</sup>
				0.720				1.180*		-1.420*
				<i>bm</i>						-4.430 <sup>13</sup>
Teriba (1997)	1960–94 Annual	EG (1987)	<i>COB</i>	1.325	1.057		2.683*			
			<i>M1</i>	1.525	1.051		2.859*			-2.854*
		EG (1987)	<i>M2</i>	1.317	0.626		2.122*			-2.819*
				1.607	0.843		0.663*			-2.209*
	1962:1– 1995:2 Quarterly		1.146	0.269		0.943*			-0.592*	
	1962:1– 1992:4 Quarterly								-0.286 <sup>16</sup>	

Table 2. (continued)

Study	Period/ Frequency	Method	Money <sup>3</sup>	Elasticity			Opportunity Cost (Semi-Elasticity) <sup>2</sup>					
				Real Income	Price Level	Own-Rate	Alternative Return	Interest Rate <sup>4</sup>	Inflation	Other		
Pakistan Arize (1994)	1973:1– 1990:1 Quarterly	EY(1987)	<i>m1</i>	0.930						-1.130	-0.030 <sup>4</sup>	
			<i>m2</i>	0.990				0.003		-1.270	-0.023 <sup>4</sup>	
Hossain (1994)	1972–91 Annual	J (1988); JJ (1990)	<i>m1</i>	1.030							-5.480	-0.040 <sup>4</sup>
			<i>m2</i>	0.770				0.038		-7.880	-0.008 <sup>4</sup>	
Singapore Arize (1994)	1973:1– 1990:1 Quarterly	EY(1987)	<i>m1</i>	0.860								-1.790 <sup>17</sup>
			<i>m2</i>	1.070				-0.330				-1.980 <sup>17</sup>
Dekle and Pradhan (1997)	1975–95 Annual	J (1988); JJ (1990)	<i>m1</i>	0.710								-1.780 <sup>17</sup>
			<i>m2</i>	1.120				-0.110				-1.830 <sup>17</sup>
Thailand Dekle and Pradhan (1997)	1978–95 Annual	J (1988); JJ (1990)	<i>NM</i>	0.620						1.620		-0.017 <sup>18</sup>
			<i>NM</i>	1.130						0.670		
Tunisia Treichel (1997)	1990:1– 1995:12 Monthly	J (1988); JJ (1990); AEG	<i>m2</i>	0.130								-0.020
			<i>m4</i>	1.070								-0.030
	1963–95 Annual		<i>m2</i>	0.800							-0.008	



Table 2. (concluded)

- <sup>1</sup>Refer to Table 1 for corresponding expansion on abbreviations used in this table.
- <sup>2</sup>Semi-elasticities except for those marked by \*, which refer to elasticities.
- <sup>3</sup>Variables in nominal term are shown in upper case letters and in real term in lower case; and all variables are in italics to show that they are expressed in logarithmic term.
- <sup>4</sup>Where own-rate or alternative return is not explicitly stated; also refers to the net interest rate measure.
- <sup>5</sup>Financial innovation variable.
- <sup>6</sup>Elasticities of those variables expressing the income and wealth concepts respectively.
- <sup>7</sup>Exchange rate measure.
- <sup>8</sup>A measure of foreign interest rate.
- <sup>9</sup>Short-term interest rate for alternative return, and the other category includes both NEER and a measure of foreign interest rate.
- <sup>10</sup>Long-term interest rate for alternative return, and the other category includes both NEER and a measure of foreign interest rate.
- <sup>11</sup>Implicit divisional price or user cost index.
- <sup>12</sup>Financial innovation variable and volatility measure for yield on long bond.
- <sup>13</sup>Measure of price variability.
- <sup>14</sup>Exchange rate depreciation.
- <sup>15</sup>Foreign exchange risk and a measure of foreign interest rate respectively.
- <sup>16</sup>Spread between local and foreign interest rates.
- <sup>17</sup>Foreign exchange risk.
- <sup>18</sup>Variable expressing foreign influence.

Figure 1. Frequency Distribution of Estimated Income Elasticities for Components of Narrow Money

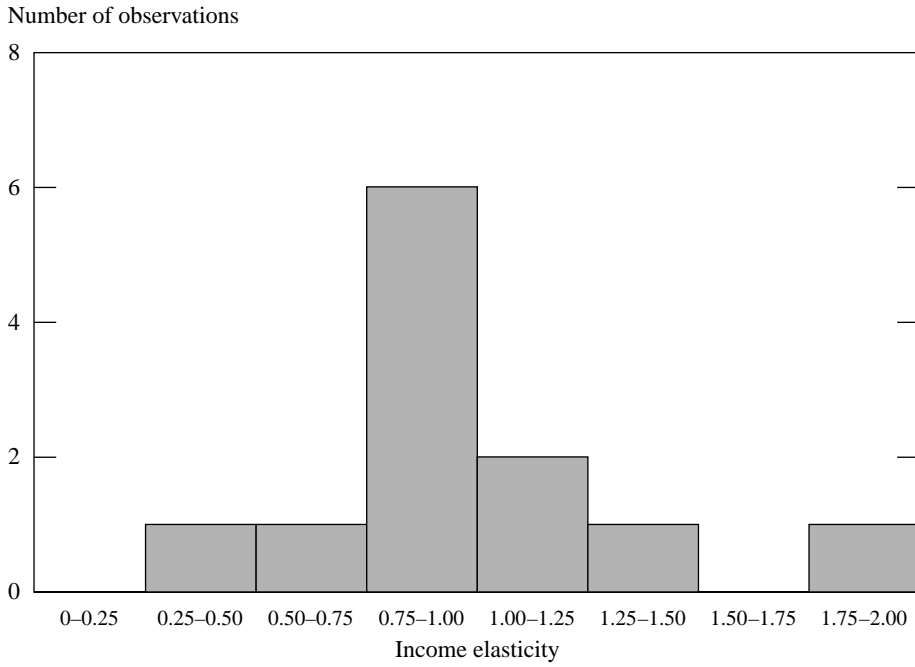


Figure 2. Frequency Distribution of Estimated Income Elasticities for Components for Narrow Money

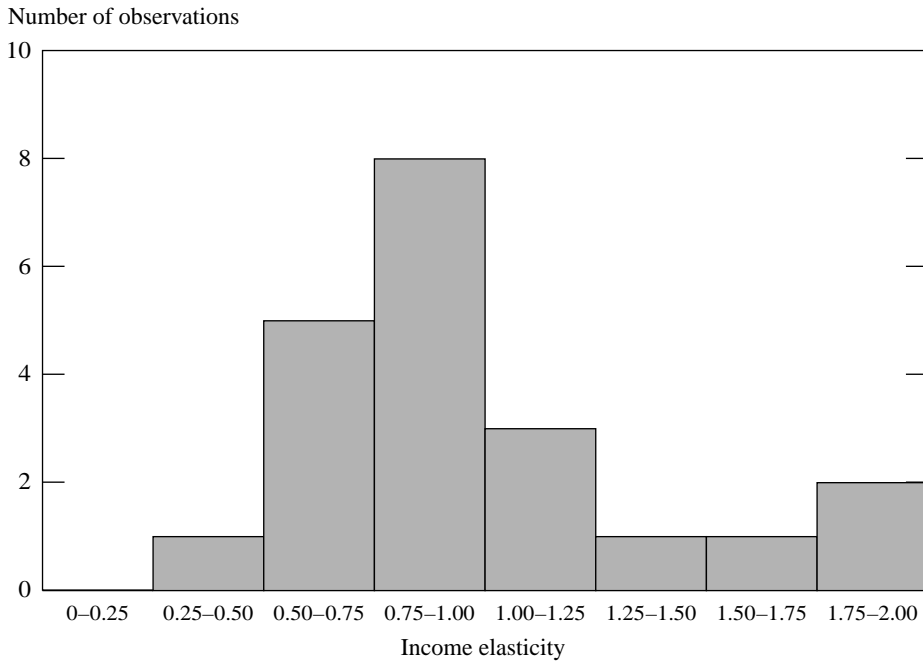


Figure 3. Frequency Distribution of Estimated Income Elasticities for Components for Broad Money

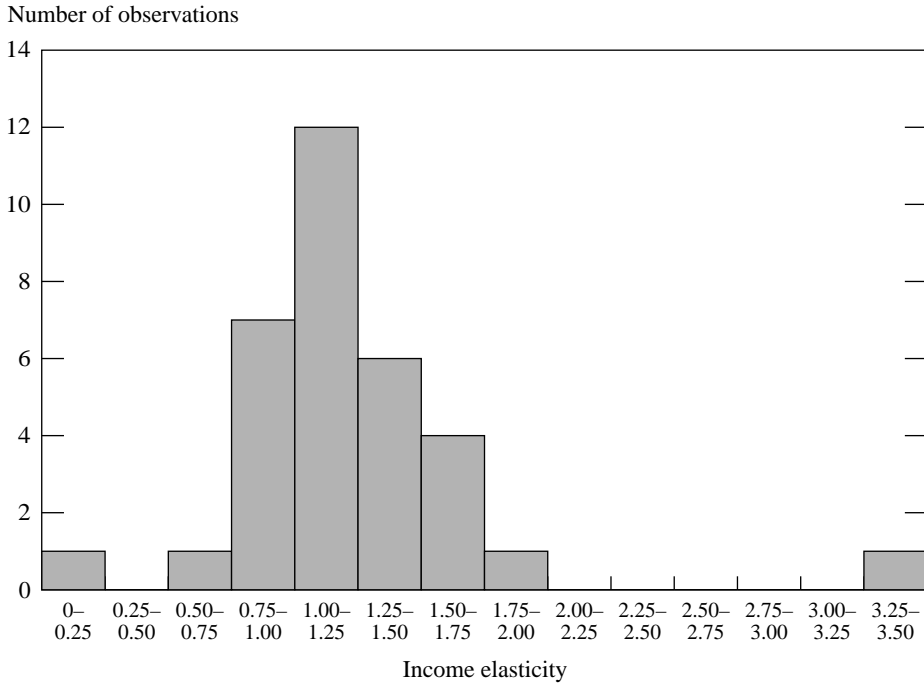


Table 3. Descriptive Statistics for Income Elasticities

	Number of Observations	Mean	Median
Components of narrow money	12	0.99	0.95
Narrow money	21	0.98	0.89
Broad money	33	1.22	1.13

Source: Table 2.

inflation. As can be seen from Tables 1 and 2, there are a number of other variables considered to tackle the country-specific issues; in addition, the open-economy type models also employ the foreign opportunity cost variables.

### III. Conclusion

The study has made an attempt to survey a number of papers that applied the error-correction models to analyzed the demand for money in a number of industrial and developing countries. The major contribution of this paper is that it has summarized the major features of these papers and presents relevant information in a comparable framework to promote easy understanding of the approaches followed, variables included, and coefficients derived. The information presented

thus will enable the researchers to compare their own results and approaches with what were undertaken previously in a wide range of countries. Alternatively, it will help identify important factors to be considered before modeling and estimating money demand in other countries exhibiting similar or different economic characteristics. In short, it will provide a starting point to conduct the money demand research using the error-correction approach.

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