

CHAPTER II

LITERATURE REVIEW

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.1 Introduction

In this chapter, I will present a brief review of the current literature that relates to the topic of the Granger-causality between monetary policy and the sectoral production. The summary of the empirical findings of the previous studies conducted are presented in Tables 2.1 to 2.5. Table 2.1 summarizes the empirical evidence review on the relationship between monetary policy and aggregate output on most of the industrial countries, while Table 2.2 summarizes the review on the relation between credit variables and aggregate output. Follow by Table 2.3 and 2.4 summarize the empirical review on the relationship between monetary policy and sectoral production, and selected empirical studies in Malaysia respectively. Finally, Table 2.5 summarizes the review on the empirical studies by using Granger-causality procedure. Generally, there are substantial literatures on this topic for developed countries. However, evidences are quite limited for developing countries, in particular, the Asian developing countries.

.2 Reviews on the Relationship between Monetary Policy and Aggregate Output

Table 2.1 summarizes the empirical evidence review on the relationship between monetary policy and aggregate output for industrial countries. Bernake and Gertler (1995) argued that the credit channel emphasis on the effect of monetary policy on the supply of loans by the banking system in affecting output via the bank reserve and deposits. The reading supported the view that the relationships between money supply and output, credit and output have been widely conducted because of the belief that money supply and credit aggregate changes have played an important role on real economic activity in United States.

Early studies by Sims (1972) found that the rational causality is unidirectional from money to income agrees with the postwar U.S. quarterly data, whereas the hypothesis that causality is unidirectional from income to money is rejected. It follows the practice of making causal interpretations of distributed lag regressions of income on money are not valid by the existence of “feedback” from income to money. Since the seminal work of Sims (1980), VAR models have become an increasing popular tool for empirical studies of the monetary transmission mechanism.^{2,1} VARs have proved to be a convenient method of summarizing the dynamic relationships among variables. Since once estimated, they can be used to simulate the response over time of any variable in the set to either an “own” disturbance or a disturbance to any other variable in the system.

¹ See Watson (1994) as well as Reifschneider, Stockton and Wilcox (1997) for a comprehensive discussion on the use of VARs and the role of econometric models in the conduct of monetary policy.

Most of the literature on VARs has dealt with how to identify the monetary shock appropriately, but Cochrane (1995) pointed out that the VAR literature does not discuss the fact that a VAR system estimated the policy shocks only in the case where a shock is followed by the customary further policy actions. In other words the effect of shock may be minor, but the subsequent policy changes in response to the shock and its effect on output might amplify the initial shock.

Peterson (1996) describes that money is broadly defined to include M2 plus large denomination time deposits and deposits in saving institutions. Splitting M2+ into two component, M1 and remainder, MD, each was found to bear a stable relationship to GDP over the 1929- 1994 period. An economic test of the causality question reveals that runs from money to economic activity. Peterson concluded that there is evidence attesting to the short-run non-neutrality of money on unemployment, and to the stabilizing influence of the private sector on the economy.

Bagliano and Favero (1998) also studied the information from financial markets and VAR measures of monetary policy. The exogenous measures of monetary policy shock, directly derived from financial market information, are used in close (US) and open (US-Germany) economy VAR models. The empirical analysis confirms the main features of the monetary policy transmission mechanism in Germany, explicitly addressing the issues between the Germany policy interest rate and the US dollar-Dmark exchange rate. Similarly, Arcangelis and Giorgio (1999) examined the monetary policy shocks and transmission in Italy using the VAR Model.

Monadjemi (1999) examined the money-income relationship in Australia and the United States during the period of the 1960s – 1990s as well as the 1960s – 1970 respectively. The empirical findings of the study, based on variance decomposition and impulse response functions show a weak long-run relationship between money and income. This result indicated that the temporary short-run changes in the relationship between money and income. However, over a long period of time, money has a neutral effect on output

Laidler (1999) examined the relationships among the quantity theory and policy regimes based on money –growth and inflation targeting are briefly discussed as a prelude to an exposition of alternative views of money's role in the transmission mechanism of monetary policy. It is further suggested that, notwithstanding the effect of institutional change in the Canadian financial system on the stability of relationships involving the quantity of money, the alternative view implies the desirability of the Bank of Canada's paying more systematic attention than it now does to the behavior of monetary aggregates, particularly narrow ones, in the design and implementation of monetary policy.

However, Freeman and Kydland (1998), "Monetary Aggregates and Output" explain how the observed correlation of money and output fluctuations may come about through endogenously determined fluctuations in the money multiplier. The model is calibrated to meet long run features of the U.S. economy (including monetary features) and then subjected to shocks to the Solow residual following features with U.S. data. Freeman and Kydland demonstrated that they are consistent with an economy in which money has no such causal influence. Similar with Karras (1996) has found that money effect on the output is neutral in European countries.

3 The Relationship between Credit Variables and Aggregate Output

Table 2.2 summarizes the review on the relation between credit variables and aggregate output. Bernanke (1986) used the contemporaneous structural vector autoregression approach (SVAR) and imposed covariance restrictions to gain identification. The credit variable used by Bernanke is the sum of the commercial bank loans extended by the intermediaries. The results showed that both money and credit convey the same information about the determination of output, and therefore support a two-target monetary policy framework based on both money and credit.

Another study by Bernanke and Blinder (1988) which employed an extended version of the IS-LM model and incorporated the sum of borrowing by households and business sectors as a credit variable, found that the money shocks became much more important as compared to the credit-demand shocks in the 1980's. However there is no strong evidence to reject the role of credit demand, and thus warrant a symmetric one on money and credit. In their model, Bernanke and Blinder (1988) have assumed imperfect substitutability between money, bonds and loans, thus allowing both the borrowers and lenders to choose between bonds and loans according to the interest rates on the two credit instruments (i.e. interest rates on loans and interest rates on bonds).

Further investigation by Bernanke and Blinder (1992) obtained similar evidence to their earlier study in 1988. By using innovation in 3-month Treasury Bill rate to capture exogenous shifts in monetary policy, they found that the decline in bank loans following a monetary policy tightening represents the credit channel. As a consequence, the loan supply is restricted via a banking lending channel. Thus, they interpret this latter evidence as consistent with the credit channel. Three conclusions have been drawn from this study. First, the fund rate is a good indicator of monetary policy even for the period after 1979. Second, nominal interest rates are good recasters of real variable. Finally, monetary policy works in part by affecting the composition of bank assets i.e. tight monetary policy affects the supply of bank loans.

Romer and Romer (1990) employ six 'episodes'^{2,2} of restrictive monetary policy, which the Federal Reserve appears to have deliberately used in an attempt to reduce the inflation rate during an economic slowdown. They argued that the purpose of using these 'episodes' as an indicator of monetary policy is to overcome the difficulty of the legitimate policy proxy to truly represent the Fed's actions^{2,3}. The estimates of the forecast errors on both money supply and bank loans show that the effect of loans' forecast is smaller than the forecast errors of money supply, therefore indicating that the money channel transmits more information to the real sector than the credit channel does.

²The series of the episodes were summarized in Table 2.2.

³Most studies in the USA used the federal funds rate as a monetary policy indicator. See, for example, Bernanke and Blinder (1992) and other studies summarized in Table 2.2.

Kashyap et. al (1993) focus on the types of debt finance may omit valuable information such as a shift in financing patterns after a change in monetary policy. This is the main criticism of the study by Kashyap, since they used commercial paper as the only form of nonbank. In fact, other sources of nonbank finance such as the issuance of the longer debt, trade credit and loans from finance companies can also be classified as non-bank debt. Kashyap has concluded that the changes in credit are at least as important as any other variable in explaining movements in output prices and interest rate.

However, the study by Gertler and Gilchrist (1995) reconfirmed the evidence found by Bernanke and Romer (1990). Gertler and Gilchrist argued that bank credit was more likely to be driven by demand factors than by monetary policy because the decline in bank credit growth lags behind the decline in money growth. The result indicated that credit market imperfections helped propagate the impact of monetary policy. Similarly criticism was made by Cecchetti (1995) on the Wash and Wolcox (1995) paper.

4 The Relationship between Monetary Policy and Sectoral Production

Table 2.3 summarizes the empirical evidence review on the relationship between monetary policy and sectoral production (disaggregate). Gauger and Ender (1989) found that the aggregate versus disaggregate results are matter of fact a contrast. While tests with aggregate level data supported the Natural Rate Hypothesis (NRH)^{2,4}, disaggregate test indicated that anticipated money growth does have significant real output effects. Thus, there are no significant net impacts from anticipated money growth when one aggregates across offsetting real impacts.

Recently, Oliner and Rudebuseh (1996) supported the existence of a broad credit channel and its operation among small firms. These results showed that a tightening of monetary policy affects small firms more than large firms. Therefore, the main implication from these studies is that using disaggregated forms of credit and different types of borrowers offers new evidence on the presence of a credit channel.

Ganley and Salmon (1997) compared the response of output to a monetary shock in nine major sectors^{2,5} and subsectors of the U.K. economy. For that purpose, they estimated for each industrial sector a separate vector error-correction model involving the interest rate, aggregate DP, the GDP deflator and sectoral output. Among the nine major sectors, they found that construction, distribution and transportation, and manufacturing exhibited the largest output

The Natural Rate Hypothesis (NRH) implies that unanticipated, but not anticipated, money stock changes can effect real economic activity. Recently, the NRH has been given a strong theoretical foundation by the New Classical Macroeconomics.

⁵ Mining, utilities, manufacturing, financial services, government services, distribution, transport and communication, agriculture, and construction.

sponses to a monetary shock. Government services, financial services, and utilities responded relatively little to the shock. The mining sector's response is somewhat erratic and ambiguous, and the agricultural sector's response is insignificant. Over all the subsectors, those industries closely linked to the construction sector reacted substantially fairly quickly (within a year), those linked to consumer's durable and semi-durable goods, such as motor vehicles, reacted substantially with a lag (within 2 years), and those linked to food show only a modest response. Sectors that are closely linked to industrial demand, such as machinery and chemical, reacted substantially with a slight lag, and they reached their maximum decline with a significant delay (over 2 years).

Hayo and Uhlenbrock (1999) used the monthly data to study the impulse responses of 28 industries in the manufacturing and mining sector in Germany to monetary shocks^{2,6}. They investigated the possible asymmetric effects of monetary policy transmission on the industries of the manufacturing and mining sector. These studies employed the VAR method of estimation. The result found that almost half of the industries show an output reaction that is significantly different from that of the aggregate manufacturing and mining sector.

Goodhart and Hofmann (2000) analyzed the role of financial variables in the conduct of monetary policy. These studies estimated a small structural model for 17 developed countries using quarterly data spanning 1973 – 1998. The results indicated that the effect of other financial variables, especially property and share prices, on the output gap is highly significant. It appears that in almost all of the countries in this data set, it is necessary to control the effect of other

Hayo and Uhlenbrock's paper also examines regional differences.

financial variables on the output gap in order to find a significant effect for monetary policy in most of the developed countries.

Another study by Malone (2000) investigates the money supply shock asymmetry using disaggregated output data in USA. A two-step estimation procedure is employed. The results indicated symmetry for the hypothesis test use shocks to the M2 money supply. These results mirror those of Gauger (1988) who found little support for the significance of unanticipated money shocks at the disaggregate level.

Lastly, Fares and Srour (2001) relies on simple vector autoregressions to investigate the monetary transmission mechanism in broad sectors of the Canadian economy. Two types of disaggregation were used, one at the level of final expenditures, and the other at the level of production. They found that a monetary contraction affects exports relatively quickly and it affects investment much more substantially than the consumption of goods, while it does not seem to affect services. Not surprisingly, durables respond much more substantially than semi-durables to a monetary contraction, while non-durables do not respond significantly. At the level of production, following a monetary contraction, construction reaches the trough of the cycle first, although, cumulatively, manufacturing reacts twice as strongly. The response of the service sector is significant, but it lags manufacturing.

5 Selected Empirical Studies in Malaysia

Table 2.4 summarizes the empirical evidence review on selected empirical studies in Malaysia. Scholnick (1991a, 1991b) and Tan (1995)²⁷ tested a disequilibrium model of lending rate determination using the Malaysian data. Both studies employed the Stiglitz and Weiss's (1981) base-line model. Using the error-correction-mechanism (ECM) specification, Scholnick's study showed that the lending rate did not fully clear the loan market. This indicated that the essence of the credit rationing was due to the slow adjustment of the loan rate. Similar evidence has also been portrayed by Tan (1995) loan rate appears to respond only feebly to loan supply factor, while not a single loan demand factor appears to have influenced it. In spite of financial liberalization, one way concludes that equilibrium credit rationing could prevail in the Malaysian financial system.

Lastly, Dimec (2000) found that the myriad of studies has succeeded in the establishing the empirical importance of the asymmetric effects of monetary policy on output and price. The results also showed that monetary tightening has a larger impact on small and medium size industries (SMIs) than it does on large manufacturing firms (LMFs).

²⁷ Scholnick (1991a, 1991b) and Tan (1995) estimated their model using the error-correction mechanism (VECM).

6 Empirical Studies by using Granger-Causality Procedures

Table 2.5 summarizes the empirical evidence review on the empirical studies by using Granger-causality procedures. A study on the United States data has been empirically tested by Christiano and Ljungqvist (1987). They found that the bivariate Granger-causality test on money and output are statistically significant when data are measured in log levels, but not when they are measured in first differences of the log. The Bootstrap simulation experiments indicate that, most probably, the first difference results reflected lack of power, whereas the level results reflected Granger-causality that is actually in the data. The reason for the lack of power in the first difference F-statistic is that first differencing the data appears to entail a specification error. Christiano and Ljungqvist concluded that money does Granger-cause output in the bivariate relation, but they removed the potential embarrassment for models that assign an important role to money in business fluctuations.

Hoya (2000) used the existence of a broad data base of 14 EU-countries included Canada, the US and Japan. Hoya found that very few general conclusions can be sustained. Based on the Granger causality test results, a number of country groups are obtained using cluster analysis, which is characterized by a similar behavior with respect to the money-output relation.

Recently, Azali and Habibullah (2000) analyze the response of the sectoral output^{2.8} to financial variables variation using Malaysia and Singapore quarterly data. They employed a sectoral augmented VAR model based on Toda and Yamamoto (1995) work as was estimated. Azali and Habibullah showed that significant changes in sectoral output differences are found among the channels of monetary transmission via financial variables. They concluded that in the case of Malaysia, money channel dominated other channels in leading the agricultural output, where credit and stock prices channel were favorable for the manufacturing and services output. The results also showed that the stock market activity is stronger in Singapore in affecting the sectoral output compared to Malaysia counterpart.

7 Conclusion

Generally, throughout the literature review, we face difficulty in concluding that the longer-causality on the sectoral production due to the existing mixed results except the Azali and Habibullah (2000)^{2.9}.

^{2.8} Manufacturing, services and agricultural sectors.

^{2.9} See Azali and Habibullah (2000). The journal paper of "Sectoral impact of monetary policy in Malaysia and Singapore." *University Putra Malaysia, Faculty of Economy and Management, Working paper no. 7626.*

Table 2.1: Studies on the Relationship between Monetary Policy and Aggregate Output

Author (Year)	Country/data frequency	Model/Method of estimation	Variable used	Findings
Ben S. Bernanke & Mark Gertler (1995)	USA monthly data 1965:1 - 1993:12	VAR system	log of real GDP; log of the GDP deflator; log of an index of commodity prices and the federal funds rate; credit aggregates	The result supports that money supply and credit aggregate have played an important role on real economy activity.
Christopher A. Sims (1972, 1980)	USA data	VAR system	money; income; GNP; wage; price level	The result found that causality runs from money to output in the USA.
John H. Cochrane (1995)	UK data	Structural Model; Anticipated-unanticipated model;	M2; federal fund; consumption GDP deflator; commodity price index;	The anticipated monetary policy can have some effect results in much shorter and smaller output response estimates closer to the predicting of most monetary models.
Willis L. Peterson (1996)	USA annually data 1929-1994	Reduce form model of U.S. labour market Granger-causality test.	M2; M1 and remainder (MD); GDP	The results showed reveals that its runs from money to economic activity. The evidence attests to the short-run non-neutrality of money on aggregate output.
Fabio C. Baglioni & Carlo A. Favero (1998)	USA & Germany data	VAR model	GDP; money aggregate; price level; US dollar-D mark exchange rate;	The empirical analysis confirms the main features of the monetary policy transmission mechanism in US and Germany, explicitly addressing the issue of simultaneity between the German policy interest rate and US dollar- Dmark exchange rate.
Giuseppe De Arcangelis and Giorgio Di Giorgio (1999)	Italy monthly data 1989:6 - 1998:5	Structural Vector Auto-regression (SVAR)	real GDP; M0; M1; M2; 3-month T-bill rate	The result found that output effect of an exogenous monetary policy shock is due to the credit rather than to the interest rate (or exchange rate) channel.

Table 2.1: Studies on the Relationship between Monetary Policy and Aggregate Output (continued)

Author (Year)	Country/data frequency	Model/Method of estimation	Variables used	Finding
Medhi S. Monadjemi (1999)	USA annually data 1960s - 1970s Australia annually data 1960s - 1990s	Dickey-Fuller and Phillips-Perron's test; error correction model (ECM)	Level of output; price level nominal interest rate; nominal value of money stock	The result shows the importance of money in explaining variation of output only in Australia and not for the U.S.
David Laidler (1999)	Canada annually data 1960 - 1998	Quarterly Projection Model (QPM); Vector Correction Model (VECM)	level of real GDP; prices level; M1; M2;	This study indicates that the supply and demand for money is crucial not only to impact of monetary policy but also to the way other shocks impinge upon economy.
Scott Freeman and Finn Kydland (1998)	USA data	Quantitative Analysis	real output; M1, Price level; nominal interest rate;	Money in the model has no causal effect on the decisions that affect real output
Georgios Karras (1996)	Sample of European countries	two-step OLS; Nonlinear least square (NLLS); Maximum Likelihood (ML)	real output; real interest rate; consumption; investment	Money effect on the output is neutral

Table 2.2 Studies on the Relationship between Credit Variables and Aggregate Output

Author (Year)	Country/data/frequency	Model/Method of estimation	Variables	Findings
Ben S. Bernanke (1986)	the USA; quarterly data 1953q:1 - 1978q:4	standard 3-variables VAR; X, P, C standard 4-variables VAR; X, P, M, C.	real GNP, X; price deflator, P; total nonfinancial debt (Credit), Consumption; M1; M2; M3;	The result shows that both money and credit convey the same information about the determination of prices, and therefore support a two-target monetary policy framework based on both money and credit.
Ben S. Bernanke & Alan S. Blinder (1988)	the USA, quarterly data 1974:q1 - 1985: q4	Instrumental Variables; logarithmic partial adjustment model.	real GNP, y; GNP deflator, P; prime rate, p; 3-month treasury bill rate, r; credit aggregate	The results of estimation indicate that the money demand shocks became much, more important relative to credit-demand shocks in the 1980's. However there is no strong evidence to reject the role of credit-demand. Thus, warrant a symmetric treat on money and credit.
Ben S. Bernanke & Alan S. Blinder (1992)	the USA monthly data 1959:7 - 1989:12	Six different five-variable VAR's were tested all data were seasonally adjusted	log of CPI; log of M1 and M2; federal funds rate; 3-month TBR; 10-years TBR non borrowed reserves of depository institutions	The result shows that the existence of long-run relationship between narrow money and inflation rate.
Karl Brunner & Allan H. Meltzer (1988)	the USA data	Multi-asset model	not mentioned explicitly in this summary article. However, their model can be traced in (ed.) Stein, 1976, pp.69 - 103.	This study moved beyond the standard IS-LM framework by incorporating a credit market and introducing a general substitution process, loan rationing supplements interest rate rationing relative to price changes.

Table 2.2 : Studies on the Relationship between Credit Variables and aggregate output (continued)

Author (year)	Country/data frequency	Model/Method of estimation	Variable used	Finding
Christina D. Romer & David H. Romer (1990)	the USA monthly data 1941 - 1984	St. Louis Equation, OLS Instrumental Variables	Bank lending loans; M1; 3-month Treasury bill rate (TBR); Industrial production.	They found that the forecast errors of credit supply is smaller than forecast errors of money supply. This implies that the money channel transmits more information than the credit channel.
Anil K. Kashyap, Jeremy C. Stein, & David W. Wilcox (1993)	the USA quarterly data 1963:q1 - 1989:q4	structural model	Commercial paper and loans; investment & inventory data; TBR; business cycle indicators	Changes in credit are at least as important as any other variables in explaining movement in output prices and interest rate.
John McCallum (1991)	the USA quarterly data 1947:q3 - 1986:q4	Credit rationing model of Blinder (1987)	log of real GDP; M1; dummies to indicate various credit rationing of credit crunch periods	The result of estimation showed that the credit rationing mechanism exists and account for about half of the total contribution of monetary shocks to fluctuations in GDP.
Carl E. Walsh and James A. Wilcox (1995)	the USA monthly data 1955:1 - 1994:12	VAR Model	the log of coincident indicators; inflation; nominal federal funds rates; prime rates; and real bank loan.	The result consistent with the credit view- supply of bank loans less effect on bank lending than output. Loan shock was a factor in the boom in the late 1980s and the recession in the early 1990's.
Mark Gertler and Simon Gilchrist (1995)	the USA quarterly data 1975:q1 - 1991:q4	VAR model	log of real GNP; commercial loans securities; inflation rate; large time deposit	The result indicate that credit market imperfections help propagate the impact of monetary policy.

Table 2.3: Studies on the Relationship between Monetary Policy and Sectoral Production

Author (year)	Country/data frequency	Model/Method of estimation	Variable used	Findings
Jean A. Gauger & Walter Enders (1989)	USA data	Two-step OLS;	log of real output; log of employment; log of real wages; labour and production index	The service sector was shown to be invariant to anticipated money stock disturbances. These results are in accord with traditional views on the effects of monetary policy.
Stephen D. Oliner & Geln D. Rudebush (1996)	quarter data of US manufacturing sector, 1975q:1 - 1991q:4	VAR model	the log of real GDP; inflation rate the nominal rate and federal funds rate; the log of financial variables (all the these variables in disaggregated form according to small and large firms)	The authors tested for the existence of a broad credit channel for monetary policy and found that monetary tightening affect small firms more than large firms. This evidence supports the existence supports the existence of a broad credit channel.
Joe Ganley & Chris Salmon (1997)	UK data	VAR system; Augmented Dickey-Fuller	Output of 24 sector of UK economy	The results indicate that the sensitivity of output to changes in monetary conditions differs markedly across industries.
Bernd Hayo & Birgit Uhlenbrock (1999)	Germany monthly data	VAR approach logit model for YIRF	data for manufacturing and mining; service sector, price level; monetary aggregate	Eight out of eleven industries exhibit a significant positive relative output reaction
Charles Goodhart & Boris Hofmann (2000)	17 developed countries quarterly data 1973 - 1998	model proposed by Rudebush and Svensson (1998)	Financial Variables; real GNP;	The result showed that property and the share prices have significant explanatory power for the output gap in most of the developed countries.

Table 2.3: Studies on the Relationship between Monetary Policy and Sectoral Production (continued)

Author (year)	Country/data frequency	Model/Method of estimation	Variable used	Findings
M. Stokes Malone (2000)	disaggregated output monthly data 1962:1 - 1999:11	Two-stages regression procedure	M2; Federal Reserve of industrial production; producer price index; federal funds rate	These results mirror those of Gauger (1988) who found little support for the significant of unanticipated money shocks at the disaggregate Level.
Jean Fares & Gabriel Srouf (2001)	Canada quarterly data 1961 - 1999	VAR model	CPI; GDP deflator; disaggregate expenditure; disaggregate production	The response of the service sector is significant but its lags Manufacturing.

Table 2.4: Studies on the Selected Empirical Work in Malaysia

Author (Year)	Country/data frequency	Model/ Method of estimation	Variable used	Findings
Barry Scholnick (1991a)	Malaysia monthly data 1985:1 - 1990:12	Stiglitz Weiss' credit rationing model (1981)	interbank rate; lending rate; deposit rate;	This study estimates a disequilibrium model of lending rate determination in Malaysia. The results of estimation support the evidence of disequilibrium in loan market
Eu Chye Tan (1995)	Malaysia quarterly data 1979q:1 - 1991q:4	Lending rate adjustment equation based on Stiglitz-Weiss Credit-rationing model (1981)	total loans and advances extended by commercial banks ; lending rate; TBR: capital and reserves of commercial banks.	Loan rate appears to respond only eligibly for the loan supply factors, while not a single loan demand factor appears to have influenced it. spite of financial liberalization, equilibrium credit could prevail in Malaysia financial system.
Ilker Dimec (2000)	Malaysia data	Var Model	Industrial Production Index; monetary aggregate; SMI; LMI	Two conclusion were highlighted: First, a myriad of studies have succeeded in establishing the empirical importance of the asymmetric effects of monetary policy on output and price. Second, the results show that monetary tightening has larger impact on SMIs than it does on LMFs.

Table 2.5: Studies Empirical Work by using Granger-causality Procedures

Author (year)	Country/data frequency	Model/Method of estimation	Variable used	Findings
Lawrence J. Christiano & Lars Ljungqvist (1987)	USA data	Granger-causality test	Money aggregate; real GDP	The result showed that money does Granger-cause output in the bivariate relation.
Bernd Hayo (2000)	14 EU-Countries quarterly data (included Canada, the US and Japan)	Granger-causality test	Money aggregate; real GDP	The Granger-causality test results found that the number of country groups are obtained using cluster analysis, which are characterised by a similar behaviour with respect to the money-output relation.
M. Azali & M.S. Habibullah (2000)	Malaysia and Singapore quarterly data 1987q:1 - 1996q:4	Toda Yamamoto (1995)	Financial variable: Manufacturing, service and agricultural sectors.	The results confirm that money is non-neutral and have forecasting power in sectoral output movements and in Malaysia and Singapore. Further more, the role of stock market activity is stronger in Singapore compared to Malaysia.