INTERNATIONAL MONETARY FUND

Country Insurance: The Role of Domestic Policies

Prepared by the Research Department

Approved by Raghuram G. Rajan

June 19, 2006

This is a discussion paper prepared by IMF staff. It is not a policy paper of the International Monetary Fund, and any positions taken should not be attributed to the Executive Board or management of the IMF. **This paper should not be reported as representing the views of the IMF**.

Contents

Ex	ecutive Summary	3
I.	Introduction	4
II.	Insurance Against What? Shocks and Their Costs	6
III.	Sound Fundamentals and Liability Structures A. The External Capital Structure of Countries	12
	B. Public Debt Management and Debt Structure	15
IV.	 Self-Insurance through International Reserves A. Trends in Reserve Accumulation, and Benefits and Costs of Reserve Holdings B. A Framework for Assessing the Optimal Level of Reserves C. Trends in Optimal Reserves for Country Groups 	18 19 26 29
V.	Conclusion	31
Re	ferences	44
Bo	xes	
1.	The Asian Bond Funds	19
2.	Argentina's GDP-Linked Securities	20
3.	State-Contingent Reserves Based on the VIX	26

Tables

1.	Output Events: Frequency, Duration and Loss, 1970–2001	8
2.	Frequencies and Costs of Shocks	11
3.	The Cost of Reserves in Emerging Market Countries, 2001–05	25
4.	Changes in Fundamentals and Optimal Reserves, Simulations for	
	Emerging Markets	
5	Types of Insurance and Crisis-Prevention Measures	32
6.	Economies by Group	
7.	Financial Account and its Sub-Components, 1970–2003	37
8.	Calibration Parameters	40
9.	Probit Estimation of the Probability of a Sudden Stop	43

Figures

1.	A "Concluded" Output Event	7
2.	Expected Cost of Shocks	12
3.	Composition of Financial Flows Around All Sudden Stops, 1980–2004	14
4.	Central Government Domestic Debt Composition, Emerging Markets, 1980-2004	17
5.	Share of Long-Term and Medium-Term Fixed Rate Domestic Currency Debt,	
	Emerging Economies, 1990–2003	18
6.	International Reserves by Country Group, 1990–2005	21
7.	International Reserve Ratios by Country Group, 1990–2005	22
8.	Reserves as a Share of GDP in Asia and Latin America, 1980–2003	30
9.	Optimal Level of Reserves as a Function of Various Factors	41
An	inexes	
I.	Annex to Section II: Data Sources and Definitions	34
**		25

II.	Annex to Section III: Behavior of Different Types of Financial Flow	35
III.	Annex to Section IV: A Model of Optimal Reserves	40

Executive Summary

Member countries are routinely faced with a range of shocks that can contribute to higher volatility in aggregate output and, in extreme cases, to economic crises. The presence of such risks underlies a potential demand for mechanisms to soften the blow from adverse economic shocks—"country insurance" for short. Protective measures that countries can take themselves ("self-insurance") include sound economic policies, robust financial structures, and adequate reserve coverage. Beyond self insurance, countries have also established regional arrangements that pool risks, while at the multilateral level the IMF has a central role in making its resources temporarily available to attenuate the costs of economic adjustment when shocks create balance of payments difficulties for a member. This paper analyzes a number of mechanisms through which countries can self-insure, leaving the role of collective regional and multilateral arrangements to subsequent papers.

The paper begins with an analysis of the nature of the shocks that countries face. An understanding of which shocks are relatively frequent and costly—and for which members—is essential to be able to tailor insurance solutions appropriately. Output drops are found to be associated primarily with real shocks (notably terms of trade declines) in developing countries, while financial shocks (such as "sudden stops") appear to play a lead role in emerging market countries. While relatively infrequent over the entire sample, wars and episodes of political turmoil are found to be extremely costly when they occur, particularly for developing countries.

Following the analysis of shocks, the paper considers some of the actions that member countries can take to self insure. Sound policies and supporting institutions have direct benefits as countries' first line of defense against the adverse effects of external shocks; they may also facilitate the issuance of long-term, domestic currency debt, and may foster increases in the share of equity-like liabilities in countries' balance sheets. This may reduce vulnerability and facilitate international risk sharing of the cost of crises. Underutilized financial instruments may also have a useful role to play in providing country insurance. Relevant examples include: catastrophe bonds for smaller, disaster-prone countries; instruments aimed at hedging against commodity price fluctuations for countries with heavily concentrated production structures; and GDP growth-indexed bonds for a broader segment of the IMF membership.

Turning to the asset side of country balance sheets, the paper develops an analytical framework to help guide judgments about the desirable level of self-insurance through reserves. In the framework, the consumption-smoothing benefits of reserves are traded off against the financial costs of holding them. The results suggest that, while reserve accumulation observed in Asian emerging markets since the early 1990s was initially commensurate with the increasing needs for insurance, more recently it seems to have been in excess of what could be justified on the basis of plausible changes in fundamentals; and, although Latin American emerging markets seemed to be underinsured in the early 1990s, their reserves are now assessed as providing a broadly appropriate degree of self-insurance given the fundamentals faced by this region.

I. INTRODUCTION¹

1. Member countries are routinely faced with a range of shocks that can contribute to higher volatility in aggregate output and, in extreme cases, to economic crises. The presence of such risks underlies a potential demand for mechanisms to soften the blow from adverse economic shocks. Such a protective infrastructure—which may of course have ancillary benefits that are not related to offering protection against the impact of adverse shocks—will be referred to in this paper as "country insurance." Protective measures that countries can take themselves ("self-insurance") include sound economic policies, robust financial structures, and adequate reserve coverage. Beyond self insurance, countries have also established regional arrangements that pool risks, while at the multilateral level the IMF has a central role in making its resources temporarily available to attenuate the costs of economic adjustment when shocks create balance of payments difficulties for a member. In addition, the Fund, through the policy advice it provides under surveillance, also has a key role in helping countries improve their own crisis proofing armor.

2. This paper analyzes a number of mechanisms through which countries can self-insure, with particular focus on national balance sheets—including the roles of countries' external liability structures and self-insurance through reserves accumulation. As foreshadowed in the Managing Director's medium term strategy, subsequent staff papers are expected to address collective insurance arrangements—regional reserve pooling arrangements, and global arrangements through a possible new instrument to provide high-access contingent financing for countries that have strong macroeconomic policies, sustainable debt, and transparent reporting, but nevertheless remain vulnerable to shocks.²

3. The nature of the shocks that countries face—and for which they may seek insurance—is worthy of examination in its own right, because a clear notion of which shocks are relatively frequent and costly—and for which members—is essential to be able to tailor insurance solutions appropriately. For example, if terms of trade shocks or natural disasters are important for one group of countries, but sudden stops in financial flows are important for another, then appropriate insurance arrangements may well differ across the two groups. Information on the structure of shocks (and their costs) for different countries is key in tailoring both policy advice on country insurance matters and regional or multilateral facilities to the diverse needs of member countries. Likewise, decisions about the appropriate or warranted level of official reserves for a country are likely to depend on the probability of facing different disturbances, and the consequences of such shocks.

¹ The authors of this study are Torbjorn Becker, Olivier Jeanne, Paolo Mauro, Jonathan D. Ostry, and Romain Ranciere.

² See IMF (2004, 2005a, and 2006) and, relatedly, a variety of other external and internal proposals on the Fund's possible role in providing country insurance, including: Calomiris (1998); Cordella and Levy-Yeyati (2005); Council of Foreign Relations Task Force (1999); Krueger (2006); Meltzer (2005); Ostry and Zettelmeyer (2005); and Rajan (2006).

4. Against this background, the present paper begins with an analysis of the frequency and economic costs of the most important shocks faced by different groups of member countries (mainly emerging market and developing countries). Output drops are found to be associated primarily with real shocks (notably terms of trade declines) in developing countries, while financial shocks (such as "sudden stops") appear to play a lead role in emerging market countries. While relatively infrequent over the entire sample, wars and episodes of political turmoil are found to be extremely costly when they occur, particularly for developing countries.

5. Following the analysis of shocks, the paper considers some of the actions that member countries can take to self insure. The major and long-lasting damage inflicted by currency, debt, and banking crises re-emphasizes the role of sound macroeconomic policies and supporting institutions as a first line of defense. Beyond this, evidence outlined in the paper shows that sound policies may facilitate the issuance of long-term, domestic currency debt, with commensurately lower rollover and foreign exchange risk; and that longer-run reforms aimed at improving broad institutional quality may also foster increases in the share of equity-like liabilities (such as FDI) in countries' external liability structures, thereby strengthening links between external payments and countries' ability to pay.

6. Underutilized private sector arrangements or financial instruments may also have a role to play in providing country insurance. Relevant examples include: catastrophe bonds and insurance against natural disasters for smaller, disaster-prone countries; commodity price futures or other instruments aimed at hedging against commodity price fluctuations for countries with heavily concentrated production structures; and GDP growth-indexed bonds for a broader segment of the IMF membership. As with many types of financial innovation, issuance of new types of instruments would have greater chance of success when undertaken by larger economies, which are more likely to provide the necessary "critical mass" for a deep and liquid secondary market, and by countries with transparent institutions and statistics—especially relevant to overcome measurement challenges posed by growth-indexed bonds.

7. On the asset side, the main form of self-insurance is of course reserve holdings—a flexible and reliable form of insurance against a wide variety of shocks. Relatively high stocks of reserves are especially desirable for emerging market countries that are exposed to sudden stops in financial flows and, more generally, for countries facing large shocks that cannot be hedged using alternative instruments. In determining a desired level of reserves, countries need to trade off the financial costs of holding reserves against the consumption-smoothing benefits of having a ready stock of reserve assets. To help guide judgments about the desirable level of self-insurance through reserves, this paper develops an analytical framework that takes into account the costs of reserve holdings, their consumption-smoothing benefits, and the role of country fundamentals in determining the likelihood of crisis.

8. The framework yields a number of insights about the degree to which reserve accumulation in different regions is warranted by the fundamentals captured by the model. For example, while reserve buildups observed in Asian emerging markets since the early 1990s are assessed to have been initially commensurate with these countries' insurance needs, they appear more recently to have been in excess of what could be justified on the basis of plausible changes in fundamentals. Further, although Latin American emerging markets seem to have been underinsured in the early 1990s, their reserves are now assessed as providing a broadly appropriate degree of self-insurance, given the fundamentals faced by countries in this region.

9. The remainder of this paper is organized as follows. Section II examines the nature and economic costs of various types of shock across different segments of the IMF's membership. Section III analyzes the roles of sound fundamentals and liability structures, especially in relation to the external capital structure of countries and public debt management. Section IV turns to the asset side of countries' balance sheets and develops an analytical framework to help guide judgments about the desirable level of self-insurance through official reserves. Section V summarizes and concludes.

II. INSURANCE AGAINST WHAT? SHOCKS AND THEIR COSTS

10. In analyzing the types of events that countries may wish to insure against, this paper will focus on drops in GDP per capita as a practical and widely available proxy for the economic costs that countries incur when adverse disturbances occur.³ This approach requires a number of simplifications—in particular, the need to abstract from distributional effects. Nevertheless, drops in GDP per capita would seem to capture many empirically relevant features of welfare declines, as well as being a highly visible measure that the public and country authorities are worried about when they consider the costs of economic crises.

³ The main results—including on the relative importance of various shocks—hold using drops in either income or consumption per capita as the proxy for the economic costs of shocks (Becker and Mauro, 2006). Consumption drops and output events are closely associated in most countries—though the association is somewhat weaker for countries that are highly integrated in international financial markets. Closer proxies for income (such as GNP rather than GDP) might also be used, but present greater difficulties with respect to data availability; this said, in most cases the differences are small.

Definitions

11. The "events" analyzed are defined as starting in the first year of a decline in GDP per capita and ending when GDP per capita returns to its pre-event level. Yearly losses are measured relative to pre-event GDP per capita and are cumulated over the duration of the

event (shaded area in Figure 1).⁴ Two further conditions are imposed to filter out events that might result from measurement error or temporary growth spurts: (i) the duration of the event must be at least two years; and (ii) the total output loss must be at least 5 percent of pre-event GDP per capita. If an event is completely observed within the sample period it is called a "concluded" event (Figure 1); this seems to correspond to the notion of a temporary, though costly, crisis. However, the analysis also includes "ongoing" events where GDP per capita has failed to recover



to pre-event levels by the end of the sample. Many ongoing events in the sample are extremely long-lasting and associated with severe output losses and prolonged growth slowdowns. (Several of these started in the 1970s and 1980s and relate to emerging and developing countries that experienced major domestic crises in the wake of civil wars, oil price increases, interest rate hikes, or adverse terms-of-trade developments from which they had not fully recovered by the end of the sample).⁵ Finally, "sub-events" are defined as new events starting before the end of a previous event.

⁵ To compute the duration and output loss associated with ongoing events (for which the end-date is unknown), it is assumed that the event ends in the first year after the end of the sample. This produces a lower bound on the durations and costs associated with these events.

⁴ A potential concern is that this approach may produce a conservative measure of the cost of output events by abstracting from trend growth during the event. On the other hand, defining the start of events and associated costs with respect to pre-event GDP might lead to an overstatement of event cost if boom-bust cycles are prevalent. Conceivably, these two biases might offset one another. As a robustness check, an alternative approach is to define the start of an event as output falling relative to a (Hodrick-Prescott-filtered) trend, and to assess the end of the event and the associated loss relative to this trend: the main results are similar.

Empirical features of output drops

12. Output events are more frequent, long-lasting, and costly for emerging market and developing countries than they are for advanced economies (Table 1).⁶ On average, both

emerging market and developing countries have output events starting about every 16 years (or approximately twice during the three decades considered in the sample period); the events last for six years in emerging markets and twice as long in developing countries. The median cumulative output loss over the event (for concluded events) is equivalent to 15 and 38 percentage points of GDP for emerging markets and developing countries, respectively. (To illustrate, a total cumulative output loss of 15 percentage points of GDP per capita would correspond to the hypothetical case of a country whose output per capita fell by 5 percentage points, remained stable for 3 years, and then jumped back up to its initial level.) For both emerging markets and developing

Table 1. Output Events: Frequency, Duration and Loss, 1970-2001

	Advanced economies	Emerging markets	Developing countries				
Sample frequency	(in percent of country-years)						
All	1.9	6.5	6.7				
Concluded	1.5	3.0	2.3				
Median duration	(in years)						
All	4	6	12				
Concluded	5	5	5				
Median cumulative loss	oss (in percent of pre-event GDP per ca						
All	15	41	89				
Concluded	13	15	38				

Sources: Maddison (2003) and staff calculations.

Notes: "All" events include concluded, on-going and sub-events. Concluded events are fully observed within the sample period whereas ongoing events had not ended by 2001 and the duration and loss for these events are calculated assuming that the events ended on 2002. Sub-events are new events that start before the previous event has ended.

countries, the frequency, duration, and especially median loss of concluded output events is significantly lower than for all events. Output losses are two to three times larger (for any type of event) in developing countries than they are in emerging markets.⁷

⁶ Throughout this paper, advanced countries are defined as in the IMF's *World Economic Outlook*, except for Korea which for the purpose of the empirical analysis is classified as emerging rather than advanced to capture the experience of its 1997–98 crisis; emerging market countries are countries included in either the (stock market based) International Financial Corporation's Major Index (2005) or JPMorgan's EMBI Global Index (2005) (which consists of countries that issue bonds on international markets), excluding countries classified as advanced by the WEO; remaining countries are classified as developing. The exact sample varies depending on data availability for each exercise. Real GDP is measured in PPP-adjusted dollars. The end of the sample period (2001) is determined by the availability of comparable data. All results are similar using an alternative classification of countries according to their level of financial development (high, intermediate, or low). Data sources and definitions are reported in the Annex.

Taxonomy of Shocks and Their Cost

13. A systematic analysis of the types of shock that are associated with output drops may help prioritize among different forms of country insurance. The shocks analyzed here include:⁸

- *financial and macroeconomic*—currency crises, banking crises, debt crises, and sudden stops in financial flows;⁹
- *country-specific external*—terms of trade and disasters;
- *sociopolitical*—wars and political turbulence;
- *global*—large increases in international interest rates and oil prices; and
- *boom-bust cycles*—the end of lending booms and growth booms.¹⁰

14. Two simplifying assumptions bear highlighting. First, the analysis does not address the causes of shocks; in particular, it does not ask whether shocks cause declines in output rather than the other way around. (Inspection of WEO forecasts for 1990–2001, however,

⁷ Furthermore, the relative impact on consumption is exacerbated by the degree of economic and financial development: for a given output decline, consumption falls more in developing countries than in emerging markets. This may reflect either liquidity constraints, or the events' more pronounced impact on permanent income in developing countries.

⁸ Volatility due to abrupt changes in aid flows, an important issue for developing countries, is not considered; but see Bulíř and Hamann, 2003, and Gelb and Eifert, 2005. For data sources and definitions of shocks, see Annex.

⁹ The present study defines a sudden stop as a worsening in the financial account balance by more than 5 percentage points of GDP compared with the previous year, though the main results hold using alternative numerical thresholds. Should sudden stops be attributed to volatile supply of international flows to emerging markets, or are they caused by worsening expectations regarding a country's economic performance? While this question cannot be answered definitively, the list of sudden stops seems to include few, if any, instances in which the stop was clearly triggered by worsening growth expectations. For the 1990s, this was confirmed by analyzing quarterly data on financial flows, identifying the first quarter when the sudden stop began, and checking that the immediately preceding *World Economic Outlook* did not forecast a slowdown in economic growth for the country in question.

¹⁰ The end of a lending or growth boom may fail to fit the usual definition of a shock; nevertheless, this type of episode is included in the analysis to capture output declines that might be part of a boom-bust cycle.

suggests that output events have been largely unexpected). Second, the analysis does not seek to separate the effects of individual shocks for those events that are associated with more than one shock. (One third of output events is associated with more than one shock; for example, various types of financial crises—currency, debt, or banking crises, or sudden stops—often occur in combination.) Moreover, the frequency and nature of the shocks may result from underlying factors—including domestic policies and institutions. Nevertheless, the associations between shocks and output drops may provide a useful gauge of the relative importance of the various types of shock for different country groups, which may help to find strategies for mitigating output costs through country insurance.

15. The importance of a given type of shock may be summarized by the expected cost of the shock or, equivalently (for cases where insurance arrangements might be conceivable), the ex-ante value of insurance (analogous to the value a risk-neutral homeowner would attach to fire insurance). Three inputs are needed, and are estimated on the basis of observed frequencies in 1970–2001 (Table 2): (i) the probability of the shock (how often a fire starts); (ii) the conditional probability that the shock will lead to a loss in output (the likelihood the house will burn down if a fire starts); and (iii) the output cost associated with the event (the cost of rebuilding the house).¹¹

16. Combining these three components (Table 2), the expected cost seems to be substantial for several types of shock (Figure 2).¹² For emerging markets, the largest expected cost is for financial and macroeconomic shocks—especially sudden stops (³/₄ percent of GDP per capita annually based on concluded events) and currency crises. For developing countries, terms-of-trade shocks are the most costly (amounting to $2\frac{1}{2}$ percent of GDP per capita annually when concluded and ongoing events are considered), followed by debt crises and global interest rate hikes. The expected cost refers to the impact of one type of shock (regardless of whether it occurs in combination with other shocks). Thus, for example, for emerging markets the expected cost is 1 percentage point of GDP for currency crises and 0.8 percentage points of GDP for debt crises, but the expected cost of both shocks would be less than 1.8 percentage points of GDP, because some part of the cost is double counted when currency and debt crises occur simultaneously.

¹¹ The expected cost will be substantially lower than the ex-post cost of observed output events, because the relevant probabilities are much lower than one.

¹² Figure 2 is based on contemporaneous correlations between shocks and output events. Similar results are obtained using lagged shocks. The figure omits advanced countries, because the value of insurance for this segment appears to be very low. This may be due to a better diversified production structure or more resilient financial systems and institutions. An additional factor, however, may be the focus on types of shock that seem to be more relevant for emerging and developing countries.

	Unconditio	onal Frequence	cy of Shocks	Frequency of Output Event Conditional on Shocks		Cumulative Output Loss Conditional on Shocks			
	Advanced economies	Emerging markets	Developing countries	Advanced economies	Emerging markets	Developing countries	Advanced economies	Emerging markets	Developing countries
	(in per	cent of count	ry-years)		(in percent)		(in percent	of pre-event G	DP per capita)
Financial and macroeconomic shocks									
Currency crisis	2.6	9.1	6.5	4.8	7.6	0.7	6	56	
Banking crisis	12.5	5.7	4.6	0.0	5.4	0.0		10	
Debt crisis	0.0	3.8	1.6		9.3	0.0		56	
Sudden stop in capital flows	5.5	11.5	15.1	3.2	9.3	1.6	7	76	10
Country specific external shocks									
Terms of trade shock	5.7	14.3	21.4	2.2	7.3	2.9	27	14	64
Disaster	0.6	2.1	3.2	0.0	4.2	2.3		41	10
Sociopolitical									
War	2.1	3.2	3.1	0.0	10.8	3.7		8	24
Political shock	0.4	3.0	3.4		5.7	5.4			55
Global shocks									
Global interest rate hike	12.5	12.5	12.5	1.0	2.8	2.4	6	19	41
Oil price hike	12.5	12.5	12.5	0.0	1.4	2.1			38
The end of booms									
End of lending boom	2.1	3.6	3.5	0.0	••••	0.0			
End of growth boom	0.4	1.1	1.3		0.0	8.8			24

Table 2. Frequencies and Costs of Shocks (Based on concluded output events, 1970–2001)

Sources and definitions: Staff calculations based on GDP data from Maddison (2003). The dates for currency, banking, and debt crises, as well as lending booms are based on existing studies (see Annex). Sudden stops in financial flows are defined as a 5 percentage point of GDP decline in financial flows, drawn from the IMF's *International Financial Statistics*. Terms-of-trade shocks are defined as a 10 percent worsening in the terms of trade of goods, drawn from the WEO data bank. The dates of disasters, wars, and political shocks are from CRED (www.em-dat.net), Correlates of War (www.correlatesofwar.com), and Marshall and Jaggers (2002), respectively. The global interest rate shock is defined as an increase in the U.S. Federal funds rate by more than 150 basis points in one year. The dates of the oil shocks are from IMF (2003). The three columns report how often the various types of shock occur; how often the occurrence of a given type of shock leads to an output decline; and the median output losses for output events associated with each type of shock. Median (rather than average) output losses are used to reduce sensitivity to outliers. Missing values indicate that the frequency of output event is based on fewer than five occurrences of the relevant group of countries).



Figure 2. Expected Cost of Shocks (in percent of pre-event GDP per capita)

Note: The expected cost of a given shock is the expected annual loss of output associated with each type of shock. It equals the unconditional probability of the shock (left panel of Table 2), times the probability of an output event given the shock (middle panel), times the median cost of the event when it occurs (right panel). The large differences in expected costs between the two panels, especially for developing countries, reflect costly ongoing events, including very long-lasting events.

III. SOUND FUNDAMENTALS AND LIABILITY STRUCTURES

17. It is generally recognized that countries can self-insure significantly against shocks through their own policies and institutions. Beyond prudent macroeconomic policies, resilience to shocks can be fostered through measures and reforms aimed at increasing flexibility in the exchange rate regime (Mussa and others, 2000; Rogoff and others, 2004), openness in the financial account (which may help cushion consumption and investment from the impact of output shocks, though it may also bring volatilities of its own, at least in the short run—see Prasad and others, 2003), and goods and labor market flexibility. Reducing constraints on the ability of entrepreneurs to shift resources across sectors might also foster resilience by enhancing sectoral diversification, though there are, of course, tradeoffs between the gains from specialization and the benefits from greater output

stability.¹³ This section, however, will focus on a specific aspect of sound fundamentals, namely the role of countries' external liability structures in fostering international risk sharing of the costs of adverse shocks, and the role of sound policies and institutions in promoting structures that can better meet countries' insurance needs.

A. The External Capital Structure of Countries

18. The composition of a country's external liabilities (that is, the shares of foreign direct investment, portfolio equity, and external debt in its external finance) is often held to be an important determinant of the risk of crisis and the economic costs countries incur when they experience a crisis. Two types of argument are put forward to support this view.

19. First, the payments associated with some types of external liabilities have desirable cyclical properties. For example, with equity-like forms of finance such as portfolio equity or FDI, payments are lower when economic performance is worse. Equity finance thus makes it possible for domestic producers to share risk with foreign investors, which helps to stabilize domestic consumption and improves domestic producers' ability to undertake projects with higher risk and expected return. Indeed, it has been argued that emerging market countries should adopt a less debt-intensive structure of external finance (Rogoff, 1999).

20. Second, some forms of flows behave in a more desirable manner during a crisis than others. For example, liquidity crises have often been triggered by sudden stops in debt flows, rather than flows of equity-like forms of finance. More generally, foreign direct investment has traditionally been viewed as more stable than portfolio financial flows.

21. The analysis in this paper offers broad support for the conventional wisdom about the external capital structure of countries during sudden stops:

- An analysis of 33 sudden stop episodes using annual data over the period since 1980 suggests that FDI has played essentially no role in financial flow reversals (Figure 3). This result is robust to alternative thresholds for defining sudden stops, and also holds using quarterly data for all emerging market countries in a specific analysis of reversals during the Russia/LTCM crisis.
- Portfolio equity also seems to play a limited role in sudden stops. Portfolio debt plays a more prominent role, though it recovers relatively quickly.

¹³ Some benefits of real sector diversification might be achievable through the financial system, e.g., by holding foreign equities or engaging in total return swaps between governments or private entities of countries with different production structures—a proposal associated with Nobel Laureate Robert C. Merton.



Figure 3. Composition of Financial Flows Around All Sudden Stops, 1980–2004 (in percentage points of GDP)

Source: Balance of Payments Statistics, International Monetary Fund.

Note: The behavior of different types of flows is illustrated in "sudden stop" time, with t=1 being the year the sudden stop occurred. The solid line represents the average across episodes for each type of financial flow. The dotted lines are one standard error bands. Sudden stops are reversals in the financial account by more than 5 percentage points of GDP. The sample is restricted to instances in which all 6 sub-components of the financial account are available for at least a 5-year period around the sudden stop year. The sample consists of 33 episodes: Argentina (2001); Barbados (1992, 2002); Brazil (1983); Chile (1991); Cote d'Ivoire (1983, 1996), Croatia (1998); Czech Republic (1996); Estonia (1998); Korea, Rep. (1997); Latvia (2000); Lithuania (1999); Mauritius (2001); Mexico (1995); Namibia (1991, 1999); Panama (2000); Peru (1998); Philippines (1997); Russian Federation (1998); Senegal (1982); Slovenia (1998); Swaziland (1993); Thailand (1982, 1997); Togo (1992); Turkey (1994, 2001); Ukraine (1998); and Venezuela (1980, 1989, 2002). For each type of financial flow, the entire available sample of countries and years is first regressed on a full set of country and year fixed effects to remove country-specific means and global trends from the data.

• Bank lending flows and official flows experience severe drops and remain depressed for several years after sudden stops.

22. While the above results underscore a protective role of FDI and equity flows during sudden stops, the relative stability of FDI appears to hold also more generally over the entire sample (including non-crisis times). For emerging and developing countries, Table 7 (Annex) suggests a clear ranking in volatility measures (taking into account the size of flows) from FDI and portfolio equity flows (low), to portfolio debt and official flows (medium), to bank flows (high). Moving beyond volatility measures, and perhaps in contrast with conventional wisdom, comovement across countries does not seem to be more pronounced for portfolio flows or bank flows (often viewed as a channel of contagion) than for FDI. Differences across financial flows with respect to other features—such as persistence, procyclicality, or responsiveness to G7 growth or US interest rates—are also not particularly striking.

23. Against this background, a key issue is what factors help to explain the external liability structures observed in particular countries. Although empirical evidence is not extensive, results based on a cross section of emerging market and developing countries suggest that equity-like liabilities (foreign direct investment and, especially, portfolio equity) as a share of total external liabilities (or GDP) are positively and significantly associated with indicators of educational attainment and, especially, institutional quality (Faria and Mauro, 2004).¹⁴ Thus, by improving institutional quality, countries may be able to secure a beneficial impact on their national external liability structures, though the effect is likely to be gradual owing to the persistence of institutional quality through time (IMF 2005b; and Johnson, Ostry, and Subramanian, 2006).

B. Public Debt Management and Debt Structure

24. In spite of the desirability of equity-like instruments, debt will undoubtedly remain an important component of the capital structure of emerging market countries. The insurance perspective suggests that—for a given cost of borrowing—debt managers should seek to induce as high a correlation as possible between debt service costs and the borrower's ability to repay. A previous study (Borensztein and others, 2004) suggested that this objective could be pursued by (i) developing domestic debt markets so as to allow borrowers to extend maturities and to issue debt denominated in domestic currencies; and (ii) denominating international debt in the domestic currency, or indexing it to real variables, such as economic growth. More specifically:

¹⁴ The Institutional Quality Index used in the estimation is the simple average of the Kaufmann and others (2003) indicators of voice and accountability; political stability and absence of violence; government effectiveness; regulatory quality; rule of law; and control of corruption. The results are robust to variations in how the index is computed. A recent firm-level analysis of corporate balance sheets in a panel of countries has also found an important effect of institutional quality on domestic financial structures, including debt-equity ratios and the ratio of short-term debt in total debt (Fan and others, 2003).

- Credibility of fiscal and monetary policies is a key prerequisite for investors' willingness to hold long-term local-currency bonds. Credibility in turn depends on both the quality of institutions and a reputation for sound policymaking. This is reflected in the differences in debt structures among emerging markets. For example, the share of foreign currency denominated or indexed debt is far higher in Latin America than in Asia, and this may reflect at least in part the regions' different inflation histories (Figure 4). Building credibility in this area can take years, but a combination of macroeconomic stabilization and institutional reforms has in practice helped to accelerate this process. Countries that curbed inflation and committed themselves to macroeconomic stability through reforms such as the establishment of central bank independence or inflation targeting regimes, adopted pension reforms that widened the domestic investor base, and used inflation-indexed bonds in the transition toward a lengthened maturity structure of the debt, have seen a payoff in the debt structure.¹⁵
- Debt instruments with equity-like features, which provide for lower payments in the event of adverse shocks and weak economic performance, could help sovereigns to improve debt sustainability and international risk-sharing. In particular, growth-indexed bonds would likely provide substantial insurance benefits to a broad range of countries, though they present a number of implementation challenges (Borensztein and Mauro, 2004; Borensztein and others, 2004).¹⁶

25. These considerations may have underpinned a number of developments in emerging market country debt structures in recent years, including:

• Greater reliance on long-term, domestic currency debt by a number of emerging market issuers. Domestic currency bonds have become more attractive for non-residents, owing in part to the development of local emerging market indices (IMF, 2005d, chapter 2). In addition, a number of emerging market sovereigns have issued *domestic currency* debt on international markets.¹⁷ And the share of long-term, domestic currency debt issued on domestic markets has recently increased somewhat, though with considerable variation across regions (Figure 5).

¹⁵ These results are corroborated in a new data set on the structure of government debt in emerging market countries (Guscina and Jeanne, 2006).

¹⁶ Chamon and Mauro (2005) provide a simple framework to price growth-indexed bonds.

¹⁷ Examples include Uruguay in 2003 and 2004, Colombia in 2004, and Brazil in 2005. In addition, private entities have issued global bonds denominated in or indexed to the local currencies in Mexico and Brazil.







Latin America



Source: Guscina and Jeanne (2006)

Notes: Short-term debt has a maturity of less than one year, medium-term has a maturity between one and five years, long-term debt has a maturity of more than five years. The data are simple averages across countries for 1980–2004. Asian economies include China, India, Indonesia, Korea, Malaysia, Philippines and Thailand. Latin American economies include Argentina, Brazil, Chile, Colombia, Mexico and Venezuela. Indexed debt involves indexation to consumer prices (or, rarely, commodity prices) and may apply to principal or coupon payments. Floating interest rate debt involves indexation to short term or foreign interest rates.





Note: The sample includes emerging economies in Latin America (Argentina, Brazil, Chile, Colombia, Mexico, and Venezuela), Asia (China, India, Korea, Malaysia, Philippines, and Thailand), and other regions (Israel and Turkey). The share of long-term and medium-term fixed rate domestic currency debt is far higher in Asia (left-hand scale) than it is in Latin America (right-hand scale).

- *The Asian Bond Market Initiative*. The establishment of a set of Asian Bond Funds has sought to foster the development of bond markets in the domestic currencies of a number of East Asian countries (Box 1). This is aimed in part at reducing countries' exposures to maturity and exchange rate risks as well as sudden stops.
- *The use of GDP-warrants in the Argentine debt exchange of early 2005.* This is by far the largest issue of growth-indexed instruments to date, for a total market capitalization estimated at US\$5.8 billion in mid-April 2006 (Box 2).

26. On the whole, these developments may be viewed as representing a gradual move toward greater reliance on long-term domestic currency debt, and greater use of innovative forms of financing, such as growth-indexed instruments. While this is encouraging, countries' liability structures are unlikely to have evolved sufficiently rapidly to obviate the need for other forms of self-insurance against sudden stops and other shocks.

IV. SELF-INSURANCE THROUGH INTERNATIONAL RESERVES

27. On the asset side of countries' external balance sheets, international reserves constitute the main form of self-insurance against damaging crises, in part because of the speed and ease with which they can be used in a period of balance of payments pressure, and because of their role in underpinning the credibility of the monetary and exchange regime, and thus warding off external pressures and currency crises. However, reserves are costly to hold because they yield a return that is generally lower than the interest rate that the authorities must offer on their debt. The authorities must therefore strike a balance between the cost of reserves in non-crisis times and their benefits in crisis times.

Source: Guscina and Jeanne (2006)

Box 1. The Asian Bond Funds¹

A number of bond funds have been recently set up by the EMEAP group of 11 central banks (Australia, China, Hong Kong SAR, Indonesia, Japan, the Republic of Korea, Malaysia, New Zealand, the Philippines, Singapore, and Thailand). The main objectives are to invest Asian reserves in Asian bonds, rather than European or U.S. bonds; to provide a new regional channel of financial intermediation with reduced costs compared with intermediation through non-regional banks; and to provide a catalyst for private investors—notably institutional investors from the region—to consider investment in Asian securities.

Ultimately, the Asian Bond Funds (ABFs) are intended to promote the development of regional bond markets and facilitate issuance of domestic currency bonds by the countries involved. The role of the ABFs is to create a demand for local instruments and—in the process of setting up ABFs—to identify and remove market impediments including: capital controls and other legal constraints, withholding taxes, and deficient clearing and settlement infrastructures. Initiatives by other regional bodies such as ASEAN and APEC are also aimed at removing regulatory and infrastructure obstacles and to increase supply of local instruments, through measures such as allowing multinationals to issue domestic currency bonds in local markets.

Thus far, two sets of bond funds have been launched under the ABF initiative. Their mandate is to invest in bonds issued by sovereigns and quasi-sovereigns from the EMEAP countries (excluding Australia, New Zealand and Japan). ABF1 was set up in 2003, with \$1bn supplied by the EMEAP central banks to be invested in U.S. dollar denominated bonds; ABF1 is managed by the BIS. ABF2, launched in 2005, consists of nine separate funds (one pan-Asian fund, PAIF, and eight local market funds) for a total of US\$2bn to be invested in local currency denominated debt. These open-ended exchange traded funds are managed by private sector institutions and will gradually be opened to institutional and retail investors.

¹ For further information on the Asian Bond Funds, see *APD Regional Outlook*, IMF, March 2005; *Global Financial Stability Report*, IMF, September 2005; and Ma and Remolona (2005).

A. Trends in Reserve Accumulation, and Benefits and Costs of Reserve Holdings

28. Total international reserves in the world economy have more than tripled since 1990, partly reflecting the rapid deepening in trade and financial integration (IMF, 2003; and Flood and Marion, 2002). The increase has been particularly pronounced in Asian emerging economies, whose share of global reserves increased by more than 20 percentage points between 1990 and 2005 (Figures 6 and 7).¹⁸

¹⁸ Considering the ratio of reserves to M2 (a measure of the ability to withstand a sudden shift in demand from local currency to foreign currency), Latin America displays the highest ratio, as expected in light of widespread de facto dollarization in several countries, though also the smallest increase. Of the 34 emerging economies in the sample, seven are defined as highly dollarized by Honohan and Shi (2002); of these, five are located in Latin America.

Box 2. Argentina's GDP-Linked Securities¹

In Argentina's recent global debt restructuring, GDP-linked securities were included in the package of new bonds issued to creditors participating in the exchange. The warrants were intended to add value to the exchange offer by providing creditors with an upside potential to Argentina's future economic growth while ensuring that the additional payments can be met by available resources. In settling its exchange on June 10, 2005, Argentina issued eleven new bonds, each with a detachable GDP-linked security. For each US\$1 of defaulted debt tendered and accepted in the exchange, creditors received new restructured bonds and one unit of GDP-linked security.

This was the largest operation to date involving the issuance of financial instruments indexed to economic growth. Following the conclusion of the exchange, a forward market for trading GDP-linked securities in *isolation* emerged, with market participants placing a higher value on the securities, partly reflecting a more favorable forecast of medium-term growth. However, the forward market was thin. Market activity picked up considerably after the GDP-linked securities were detached and began trading independently, on November 30, 2005. At that time, total market capitalization amounted to US\$2.9 billion. Subsequent upward revisions to growth expectations have led prices approximately to double—to 9.3 cents per dollar of notional value in mid-April 2006—with total market capitalization reaching US\$5.8 billion.

Payments on the GDP-linked securities are contingent on Argentina's economic performance. The securities will pay only if *both* the level and growth of GDP exceed a specified threshold in the relevant reference year, beginning in 2005 and ending in 2034. In addition, the sum of payments that can be received during the life of the security cannot be higher than 48 percent of its notional value. Payments will be made on December 15 of each year following the relevant reference year. The first payment of about 0.2 percent of GDP is expected on December 15, 2006.

As the GDP-linked securities were attached to their underlying bonds at the time of the debt exchange, it was difficult to separate the valuation of each item. The value of the restructuring offer was priced by market participants in the range of 34-35 cents per dollar of principal claims. Market analysts at that time estimated the "theoretical value" of the GDP-linked securities to be about 4 points (cents per dollar of notional value), but recommended adopting a conservative approach and valuing the GDP-linked securities at half the estimated theoretical value. The conservative approach reflected a host of factors that are hard to quantify, including the novelty of the instrument and other possible obstacles analyzed in Borensztein and others (2004).

¹ The authors of this box are Marcos Chamon and Cheng-Hoon Lim

29. The causes of rapid reserve accumulation have been the subject of fervent debate, for example regarding whether accumulation in Asia reflects a desire to keep exchange rate stability in the face of significant current and financial account inflows, rather than crisis prevention efforts (Dooley and others, 2004; Goldstein, 2004; and Genberg and others, 2005). An analytical framework to gauge the benefits and costs of international reserves would thus seem helpful for shedding light on recent developments as well as giving policy guidance. This section reports results based on a calibrated model for emerging market countries (Jeanne and Rancière, 2005). The model focuses on an open economy that is hit by financial flow reversals, which in turn lead to falls in output. The optimal level of reserves in the model equates the opportunity cost of holding foreign reserves with the marginal benefit from being able to smooth domestic consumption in the event of a sudden stop.





Source: *International Financial Statistics*, International Monetary Fund. Note: Data for 2005 refer to stocks at the end of the second quarter of 2005.

Benefits

30. From an insurance perspective, countries hold reserves to achieve a range of objectives, whose relative importance depends on several factors, such as the exchange rate regime and the degree of integration in international financial markets. Such objectives include: limiting volatility in the exchange rate; providing liquidity to the foreign exchange market, thus making a floating exchange rate regime more efficient; buffering the domestic economy against shocks to the balance of payments; and providing liquidity to the domestic financial markets and the banking sector, especially if there is significant dollarization (Jeanne and Wyplosz, 2003).



Figure 7. International Reserve Ratios by Country Group, 1990-2005

Sources: International Financial Statistics and World Economic Outlook, International Monetary Fund; World Development Indicators, World Bank.

Notes: Data for 2005 refer to the end of the second quarter for the stocks of reserves and M2, and to WEO projections for GDP and imports. "Emerging others" includes emerging economies in Eastern Europe, the Middle East, and Africa. For each country group, the data refer to unweighted cross-country averages. For the developing countries, reserves as a share of M2 and reserves as a share of short-term debt are medians, to avoid undue influence of outliers.

31. With countries' increasing international financial integration, considerations regarding reserve adequacy have shifted from an emphasis on trade (traditionally associated with the "three-months-of-imports" rule) to the financial account and balance sheet fragilities (associated with the "Greenspan-Guidotti" rule, according to which reserves should cover short-term debt). Indeed, if one considers a sample of 33 middle-income countries during 1980-2003, 31 out of 40 large decumulations (more than 10 percentage points of GDP) are associated with a sudden stop, a currency crisis, or a banking crisis.¹⁹

32. Reserves have played an important role in cushioning domestic absorption (that is, consumption and investment) during financial account reversals. The typical sudden stop—which sees average net inflows of 5 percent of GDP (in the year prior to the stop) turn to net outflows of 4 percent of GDP (in the year of the stop)—is accompanied by a large drop in reserves (by 4 percentage points of GDP). This drop helps to hold the observed fall in domestic absorption to $2\frac{1}{2}$ percentage points of GDP, much smaller than the counterfactual fall in domestic absorption ($6\frac{1}{2}$ percentage points of GDP) that would have been observed if reserves had been held constant during each episode.

33. It has also been argued that reserves help reduce the likelihood of crises, including by: discouraging speculation against the domestic currency; making it easier for the public and private sectors to roll over their foreign currency debt; and instilling confidence in the domestic financial sector. Empirical evidence on these benefits is mixed, owing in part to methodological difficulties. An increase in the ratio of reserves to short-term debt has been found to be associated with a lower probability of a currency crisis or sudden stop (Bussière and Mulder, 1999; and Garcia and Soto, 2004).²⁰ However, the robustness of this finding has been questioned out of sample (Berg and others, 2004), and because of reverse causality (Detragiache and Spilimbergo, 2001).

Costs

34. The cost of holding reserves is usually measured as the difference between the return on short-term foreign currency assets and the return on more profitable alternative investment opportunities. The simplicity of this approach, however, masks thorny questions regarding the appropriate definition of alternative investment opportunities, which have traditionally been interpreted as the repayment of foreign debt (Frenkel and Jovanovic, 1981; and Flood and Marion, 2002), or higher-yielding investment opportunities in the domestic business sector or public infrastructure (Ben-Bassat and Gottlieb, 1996; and Hauner, 2005).

¹⁹ Banking and currency crises are drawn from Caprio and Klingebiel (2003) and Ghosh, Gulde and Wolf (2002), respectively.

²⁰ A higher level of reserves has also been found to reduce the portion of exchange rate volatility that is unrelated to macroeconomic fundamentals (Hviding and others, 2005).

35. Even following the traditional approach based on the opportunity cost of repaying long-term foreign debt, plausible arguments can be made both in favor of and against using only some subcomponents of the yield on bonds issued by an emerging market country. The full yield can be thought of as the sum of four components: (i) the short term rate on U.S. Treasuries; (ii) the term premium—the difference between long-term and short-term U.S. interest rates; (iii) the default premium; and (iv) the risk premium due to a possible correlation between the tendency for defaults and the global cycle or global asset prices. While in practice the default premium and the risk premium cannot be observed separately, they are conceptually distinct and may need to be treated differently. There is some evidence to suggest that the risk premium is small, because in practice there is essentially no relationship between emerging-market defaults and the "world market portfolio" held by international investors (Borensztein and Mauro, 2004). However, to the extent that investor classes are segmented, and investors specialize in emerging market bonds and other assets that comove strongly with them, the risk premium could be significant. Regarding the default premium, one could argue that it should be excluded on the grounds that, on average, it is a fair reflection of the probability of non-repayment. At the same time, country authorities that have no intention of defaulting will likely include the default premium when computing the cost of holding reserves. Given the size and variation of the default premium across countries and over time, the choice of whether or not to include it has important implications for the results, as discussed below. The opportunity cost of holding reserves is thus estimated using two variants: (a) the U.S. term premium, that is, the difference between long and short rates excluding the default and risk premia-the baseline in this paper; and (b) the full difference between emerging market yields and U.S. short-term Treasuries.²¹

36. On average, the total cost of holding reserves was substantially lower in Latin America than in Asia in 2001–05 (ranging between 0.2–0.4 percentage points of GDP, and 0.3–0.8 percentage points of GDP, respectively) using the term premium (Table 3). The cost was, however, relatively similar in the two regions using the term premium plus the spread (ranging between 1.0–1.6 percentage points of GDP in Latin America and 0.7–1.2 percentage points of GDP in Asia). This is explained by the fact that, while on average the reserves/GDP ratio is twice as high for Asian countries as for Latin American countries, the sovereign spread is substantially higher in Latin America than in Asia. The cost of holding reserves has increased moderately for emerging market countries over the past few years, as the impact of reserve accumulation has been partly offset by a reduction in sovereign spreads.

37. While the analysis above assumes that reserves are held in liquid assets such as shortterm fixed income instruments issued by the major advanced countries, the cost of holding reserves might be reduced by investing in longer-term, higher-yielding foreign assets (Genberg and others, 2005). For the specific case of economies experiencing large financial

²¹ The analysis considers the ex-ante cost of holding foreign reserves and thus, in light of the unpredictability of exchange rates, abstracts from exchange rate gains or losses, even though these can turn out, ex post, to be substantial (Hauner, 2005).

inflows and accumulating substantial reserve stocks, a related idea is to use these favorable external circumstances to make gradual progress toward financial account liberalization, with a portion of financial inflows being securitized through closed-end mutual funds that issue shares in domestic currency and use the proceeds to purchase foreign exchange from the central bank and then invest abroad (Prasad and Rajan, 2005). This would eliminate the fiscal costs of sterilizing inflows, give domestic investors opportunities for international diversification, stimulate the development of domestic financial markets, and allow central banks to control both the timing and quantity of outflows.

	2001	2002	2003	2004	2005
Reserves/GDP (in percent)					
Latin America	12.1	11.6	12.5	13.5	14.0
Asia	21.2	22.6	25.3	28.9	29.1
Others	17.5	20.0	21.3	21.8	21.3
Cost of reserves (in percent of GDP)					
based on Term Premium					
Latin America	0.2	0.3	0.4	0.4	0.2
Asia	0.3	0.7	0.8	0.8	0.3
Others	0.3	0.6	0.6	0.7	0.3
Cost of reserves (in percent of GDP)					
based on Term Premium+ Sovereign Spread					
Latin America	1.0	1.6	1.4	1.4	0.8
Asia	0.9	1.1	1.2	1.2	0.7
Others	1.1	1.5	1.2	1.0	0.5

Table 3. The Cost of Reserves in Emerging Market Countries, 2001–2005

Source: *International Financial Statistics* and *World Economic Outlook*, IMF, and J.P.Morgan. The cost of reserves is computed as the stock of reserves times either the term premium (the differential between the yields on 10-year and 3-month U.S. treasuries) or the term premium plus the EMBIG spread. All regional averages are unweighted.

38. Another way of reducing the cost of self-insurance through reserves may be to hold assets that provide liquidity at the time when countries most need it, thus obviating the need to hoard large amounts of reserves in noncrisis times. For example, a commodity exporter might hold instruments whose return is inversely related to the price of its main exports; or an emerging market country could hold instruments that provide liquidity when international liquidity conditions are tight. One possibility would be for the central bank's portfolio to include instruments whose payoff is positively related to the implied volatility index on the S&P500—the so-called "VIX," which has displayed an empirical association with recent sudden stops episodes. Such a proposal—advanced by Caballero and Panageas, 2004 and 2005—is summarized in Box 3.

Box 3. State-Contingent Reserves Based on the VIX

Given the cost of holding reserves, a strategy that made it possible to have reserves only in times when they are needed would yield considerable savings. With that goal in mind, a hedging approach for the management of international reserves based on the use of contingent securities has been proposed by Caballero and Panageas (2004, 2005). The authors suggest that a central bank would find it optimal to invest part of its reserves in contingent securities that provide a return when a sudden stop occurs. The authors argue that such a hedging strategy can be efficiently implemented by using options on the S&P500 implied Volatility Index ("VIX").

The VIX is an index of near-term U.S. financial market volatility based on the prices of S&P500 stock index options. It tends to increase when investors are more reluctant to participate in risky markets. More importantly, the authors show that spikes in the VIX are correlated with sudden stops in emerging markets (the probability of observing a statistically significant "jump" in the VIX, conditional on a sudden stop, is about 70 percent). The authors derive the optimal hedging portfolio of a central bank using risk-free liquid assets and call options on the VIX. This portfolio increases the expected reserves during sudden stops by as much as 40 percent, compared with a portfolio invested only in risk-free assets.

An advantage of VIX derivatives for central banks is that the VIX index is correlated with sudden stops but is independent of country policies, thus limiting moral hazard and measurement issues. However, the current size of the VIX market is relatively small. (The notional value of open futures contracts is about US\$1.5 billion. Options are traded over the counter.) Two potential concerns would remain even if the market were to become much larger. First, it is not clear whether the correlation observed in recent years between occurrences of sudden stops and spikes in the VIX index will persist in the years ahead. Second, investors holding short positions on call options on the VIX might be already exposed to emerging markets through other assets; in the event of a sudden stop, the central banks might then face a serious counterparty risk. Investors might be unable to honor their obligations on the VIX contracts should they take losses on other assets as well.

B. A Framework for Assessing the Optimal Level of Reserves

39. While recognizing that the benefits of reserves are multifaceted, reserve adequacy has traditionally been assessed using "rules of thumb" based on ratios of reserves to imports or, reflecting greater international financial integration, to short-term debt. Although these provide useful guidance, they lack fully developed analytical foundations. The remainder of this section seeks to fill this gap by developing an analytical framework that may be useful for making judgments about the level of reserves that is warranted by a country's particular fundamentals. The analysis focuses on the role of reserves as self-insurance against

vulnerabilities resulting from changes in the financial account balance, and may thus be especially relevant for emerging markets facing a risk of sudden stops.²²

40. The main benefit of reserves in the context of the model is that they help to smooth domestic consumption in response to decreases in financial inflows and output. Based on a calibration of the model, the warranted level of reserves can be derived as an explicit function of factors that include the probability of a sudden stop, the size of a sudden stop, the output cost of a crisis, the opportunity cost of reserves, and the authorities' risk aversion visà-vis crisis episodes. The probability of a sudden stop is based upon panel probit regressions that relate sudden stops to country fundamentals (including the exchange rate regime, financial openness, the level public debt, de facto dollarization, output growth, and exchange rate overvaluation).²³

Warranted reserves as a function of macroeconomic fundamentals

41. The model can be used to compute the impact of a change in fundamentals (for example, a change in the debt/GDP ratio) on the warranted level of reserves.²⁴ A change in fundamentals will affect the probability of a sudden stop (to an extent estimated by the probit model), and the calibration will determine the implications for the optimal level of reserves.

42. Plausible changes in fundamentals have a substantial impact on the optimal level of reserves (Table 4). The (comparative statics) results may be summarized as follows:

• Moving from no real exchange rate overvaluation to an overvaluation of 20 percent increases the estimated annual probability of a sudden stop by approximately

²⁴ The exercise is based on a benchmark economy characterized by the calibration parameters presented in the Annex (Table 8), with the cost of holding reserves based on the term premium only. The effect of a change in each fundamental on the optimal level of reserves is analyzed by comparison with the optimal level of reserves in the benchmark economy.

²² For further details, see Jeanne and Rancière (2006). Other related studies include Aizenman and others, 2004; Lee, 2004; Aizenman and Lee, 2005; and Caballero and Panageas, 2005.

²³ More specifically, in the version of the model presented in the Annex, the probability of a sudden stop is estimated for each country and each year by applying the regression coefficients to the observed country fundamentals. The size of the sudden stop and the output cost of a crisis are assumed constant (and identical across countries) and are estimated as the observed averages for the 33 countries in the sample over 1980–2003. Risk aversion is also assumed constant across countries and over time, at a level that is well within the range of plausible estimates available from existing studies. The opportunity cost of holding reserves is the term premium and therefore varies over time but not across countries.

4.3 percentage points, and generates an increase in the optimal level of reserves of 2.7 percentage points of GDP.

- A rise in the ratio of public debt to GDP from 40 percent to 60 percent implies an increase in the optimal reserve ratio by 1.7 percentage points of GDP.
- A large buildup of the ratio of foreign liabilities to money, calibrated on the experience of Thailand between 1990 (45 percent) and 1997 (262 percent), raises the optimal level of reserves by 3.7 percentage points of GDP.
- A one standard deviation increase in the degree of financial openness (measured by the absolute value of gross inflows, divided by GDP) leads optimal reserves to increase by 3.2 percentage points of GDP.
- A change from a floating to a fixed exchange rate regime induces an increase in the optimal level of reserves of 3.4 percentage points of GDP.

43. The changes in fundamentals analyzed above are sizable, but have certainly been observed in the sample considered. Interestingly, such assumed changes in *one* fundamental variable lead to large changes in optimal reserves, in some cases by one third to one half of the initial optimal level of reserves. The next subsection considers the impact on optimal reserves of the observed combination of changes in all fundamentals simultaneously.

Estimated Change in Change in Change in Change in Optimal **Optimal** Level **Optimal Ratio** Fundamentals Sudden Ratio of of Reserves of Reserves to (in percent unless Parameter Change Short Term Sample Stop Reserves (in months (in percent) Probability of Imports) otherwise noted) Mean to GDP Debt Exchange Rate $0 \rightarrow 20$ Overvaluation 0.0 4.3 2.7 1.3 34.6 $40 \rightarrow 60$ Public Debt /GDP 40.02.2 1.7 0.8 21.845 (Thailand, 1990) 7.0 3.7 Foreign Liabilities / 46.0 1.8 47.4 Money \rightarrow 262 (Thailand, 1997) **Financial Openness** defined as (|gross inflows|)/GDP 5.5 $5.5 \rightarrow 10.4$ 5.4 3.2 1.5 41.0 Exchange Rate Regime Floating \rightarrow Fixed 5.3 3.4 1.6 43.5

 Table 4. Changes in Fundamentals and Optimal Reserves, Simulations for Emerging Markets (in percentage points unless otherwise noted)

Sources and definitions: See Annex.

Notes: The initial optimal level of reserves is equivalent to 8.2 percent of GDP (about 3 months of imports, or 105 percent of short-term debt). The results are based on regression (1) in Table 9 (Annex)—except for the exchange rate regime, which is based on regression (2). All fundamentals are averages of the first and second lags.

C. Trends in Optimal Reserves for Country Groups

44. The optimal level of reserves—based on the calibrated model—is computed for each country and year for the 33 middle income countries used in the probit estimation, over 1980–2003. To trace the implications of the model for trends in optimal reserves, results are then summed up to obtain regional averages for Latin American and Asian emerging markets.²⁵ For each country and year, the probability of a sudden stop is computed on the basis of the probit estimates. The size of the sudden stop is set to its realized mean value in each region and each decade. The only unobservable parameter, risk aversion, is set equal to six—a value selected to match the actual mean level of reserves to GDP in Asia in the middle of the sample period (1991).²⁶ Using this approach, it is possible to compare changes over time in the optimal level of reserves, actual reserves, and the three-months-of-imports and Greenspan-Guidotti rules of thumb (Figure 8).

45. For the group of Asian emerging markets, the model suggests that reserves should have declined somewhat between the early and the late 1980s: in the aftermath of the debt crisis of the early 1980s, a slowdown in financial flows to emerging markets contributed to reducing the probability of sudden stops. Beginning in the early 1990s, the model envisages a rapid increase in optimal reserves, owing to rising international financial integration.²⁷ The slight decline in optimal reserves following the Asian crisis is primarily accounted for by the reduction in public debt and financial flows. Although the model is intended to be normative, it is interesting to note that it outperforms the rules of thumb in predicting the actual level of reserves for most of the period under consideration. In particular, the upward trend in reserves in Asia during the decade prior to the Asian crisis (1985–96) is matched more closely by the model than by the alternative rules depicted in Figure 8.

46. For the Asian emerging market countries following 1997–98, however, the model suggests that the buildup in reserves may have been excessive—a finding consistent with previous analyses (IMF, 2003). A possible caveat is that the Asian crisis may have led to an upward revision of the size of sudden stops or of the associated output loss, though the revision would need to be very large for actual accumulation to be consistent with the increase in optimal reserves predicted by the model. For example, in order for the model to explain the increase in the average level of reserves held by emerging Asian countries

²⁵ The remaining emerging markets in the sample form a limited and heterogeneous group the related average is therefore not reported.

²⁶ Ogaki, Ostry, and Reinhart (1996) provide estimates by region of this parameter.

²⁷ A further factor contributing to the increase in optimal reserves in the mid-1990s, and the post-crisis decline, is the buildup and subsequent unwinding of foreign currency liabilities, particularly in Thailand.





Source: Staff calculations using data from *International Financial Statistics*, International Monetary Fund and *Global Development Finance*, World Bank.

Note: Total reserves minus gold (excludes IMF financing).

between 1997 and 2003, the expected size of either the sudden stop or the output cost would have had to more than double relative to its average level observed in the 1990s.²⁸ Another possible caveat is that the crisis may have led some countries to revise their views on the availability of other sources of insurance—such as financial support by the international financial institutions. A further note of caution on the result of excessive reserve accumulation is that some countries may envisage measures to increase their degree of integration in international financial markets, and may thus be preparing for greater exposure to international financial flows.

47. In Latin America, warranted reserves appear to have been well in excess of actual reserves in the 1980s, a turbulent period for the region. Predicted reserves are lower in the early 1990s, partly on account of improved fundamentals (public debt and economic growth), but the rise over the course of the past decade seems to be in line with heightened international financial integration and increasing de facto dollarization. The close match between the model and the data in 1991-2003 is notable, considering that no individual-year level of reserves for Latin America has been used in the calibration.²⁹ The model might be interpreted to suggest that the current level of reserves is, on average, adequate in Latin America. However, it is important to recall that while the model includes de facto dollarization among the determinants of the likelihood of sudden stops, it does not take into account that output losses may be greater for dollarized economies in the event of a crisis.

V. CONCLUSION

48. The stylized facts presented in this study suggest that countries are subject to a wide variety of shocks that often have major, enduring consequences for levels of aggregate output, and thus for economic well-being. Against this background, mechanisms aimed at preventing such shocks from causing excessive economic disruption have the potential to provide sizable benefits for the affected countries and the global economy as a whole. This paper has examined various types of insurance mechanisms that countries can pursue to soften the blow from adverse shocks and their relevance for different segments of the IMF's membership (Table 5).

49. While all countries are subject to a range of financial and real shocks, the types of shock differ considerably across country groups. For developing countries, real shocks, such

²⁸ Increasing the risk aversion parameter from 6 to 10 (the maximum value considered in existing studies on growth and business cycles) would lead the warranted level of reserves to increase by less than 3 percentage points of GDP, much less than needed to explain the post-crisis buildup in emerging Asia's reserves.

²⁹ Extensions of the model might help explain a portion of the difference in reserve holdings between Asia and Latin America: this would be the case, for example, if one were to consider the opportunity cost based on the sum of the term premium plus the individual-country sovereign spreads, because spreads are lower in Asia and Latin America.

Measure/Type of Insurance Especially Relevant for which Countries?		Time Frame/Difficulty
Sound macroeconomic and financial policies	All countries	Impact to be observed in the short term
Improving institutional quality	All countries. Evidence suggests this should help increase the share of equity-like liabilities (e.g. FDI and portfolio equity) in countries' total external liabilities	Medium term
Appropriate debt management	Emerging market countries. Evidence suggests sound policies (macroeconomic stability and supporting institutional reforms) may facilitate an increase in the share of long-term domestic currency debt	Impact to be observed in the short term
Innovative financial instruments	Emerging markets and developing countries. Instruments with equity-like features (e.g. growth- indexed bonds) could help improve debt sustainability and international risk sharing. Larger economies are more likely to attain the requisite "critical mass" to ensure sufficient liquidity of the instruments. Financial instruments aimed at hedging against commodity price fluctuations may be relevant for countries with heavily concentrated production structures. For disaster-prone developing countries, disaster insurance may be appropriate	Immediate in principle, but obstacles in practice. May require some international coordination
Appropriate reserve holdings	Emerging markets and developing countries. Strong reserve positions are especially important for dollarized economies and financially integrated economies	Impact to be observed in the short term
Collective arrangements: including high access contingent financing instrument proposal; IMF support for regional pooling arrangements	Emerging market countries	To be taken up in subsequent papers for the Board's attention

Table 5. Types of Insurance and Crisis-Prevention Measures

as changes in the terms of trade, tend to rank among the most costly, though the debt crises of the early 1980s also inflicted considerable economic damage. For emerging market countries, in contrast, greater integration in global financial markets has been associated with higher exposure to financial shocks, often triggered by sudden stops. Financial shocks are by far the most significant shocks for the emerging market segment of the IMF's membership.

50. For all countries, the first line of defense against adverse shocks is the pursuit of sound policies. In light of the large costs experienced by emerging markets and developing countries as a result of past debt crises, fiscal policies should seek to improve sustainability, taking into account that sustainable debt levels seem to be lower in emerging and developing countries than in advanced countries. Appropriate debt management, aimed at increasing the share of long-term, domestic currency debt in total debt would also pay dividends. Efforts to improve the structure of the liability side of national balance sheets more generally, by increasing the share of equity-like liabilities, such as FDI, would also be well rewarded. The evidence presented in this paper suggests that macroeconomic stability and supporting institutional reforms may facilitate the move toward safer liability structures.

51. A range of financial instruments may also have a role to play in providing country insurance. Relevant examples include: catastrophe bonds and insurance against natural disasters for smaller, disaster-prone countries; commodity price futures or other instruments aimed at hedging against commodity price fluctuations for countries with heavily concentrated production structures; and GDP growth-indexed bonds for a broader segment of the IMF's membership. New instruments would have a greater chance to succeed with large issuers, which are more able to provide the necessary "critical mass" for a deep and liquid secondary market.

Maintaining appropriate cushions of official reserves is also clearly an essential part 52. of countries' self-insurance toolkit. The analytical framework developed in this paper may be useful in clarifying judgments about the trade-off between the costs of holding reserves and the benefits they provide in smoothing the impact of external shocks. Applied to data for the past two and a half decades for a sample of more than thirty middle income countries, the framework suggests that the rapid reserve accumulation observed in Asian emerging markets since the early 1990s may now have resulted in a degree of self-insurance that is above what can be justified on the basis of plausible changes in fundamentals. More specifically, while increased international financial integration and the related potential for financial flow reversals seem consistent with the rapid increase in reserves observed in earlier years, for the period since the late 1990s reserve accumulation seems to be excessive compared with what the model would estimate as appropriate self-insurance. For Latin America, the model suggests a substantial degree of under-insurance at least until the early 1990s, though on average reserves may have reached broadly adequate levels in recent years; an open issue that might alter this judgment is that the model may not fully account for larger output losses in the presence of de facto dollarization.

53. Although much can be accomplished by individual countries through sound policies, risk management, and self-insurance through reserves, collective insurance arrangements are likely to continue playing a key role in cushioning countries from the impact of shocks. Collective insurance arrangements—insurance through regional or other pooling arrangements such as the Chiang Mai initiative, or global insurance through international financial institutions—hold promise because of their ability to pool risks, which makes them potentially more cost-effective than self-insurance. These issues are to be taken up in separate papers over the coming months.

I. ANNEX TO SECTION II: DATA SOURCES AND DEFINITIONS

Data on per capita GDP are purchasing power parity adjusted (1990 international Geary-Khamis dollars), drawn from Maddison (2003). For the purposes of the present study, the sample period is limited to 1970–2001, yielding 4,882 country-year observations. At the end of the sample period, the data cover 167 countries. The shock dates or the criteria for identifying shock dates are mainly based on existing studies. As different studies analyze different types of shock, samples vary and in general do not cover the same extensive set of country-years available for the output data.

Financial and macroeconomic shocks. Currency crises are identified using the following three conditions (as in Frankel and Rose, 1996): (i) devaluation/depreciation of at least 25 percent cumulative over a 12-month period; (ii) devaluation/depreciation rate by at least 10 percentage points greater than in the preceding 12 months; (iii) a minimum of 3 years since last crisis. Given the relatively large depreciation/devaluation required, the definition of a currency crisis seems geared toward emerging and developing countries; nevertheless, to ensure consistency, the same definition was applied to all countries, using IFS data. The banking crisis dummy takes the value 1 if at least one of the following studies identifies the country-year as an outbreak of a banking crisis: Kaminsky and Reinhart (1999), Vila (2000), Bell and Pain (2000), Caprio and Klingebiel (2003), and Demirguc-Kunt and Detragiache (2005). The use of several studies produces a large sample, though the definition of a banking crisis is not identical across studies. Using banking crisis dates drawn from only one study does not change the main results. The debt crisis dummy records a 1 if at least one of the following studies identifies the country-year as the beginning of a debt crisis: Detragiache and Spilimbergo (2001), Manasse and Roubini (2005) and Reinhart, Rogoff, and Savastano (2003). As mentioned in the text, sudden stops in financial flows are defined as a worsening in the financial account balance by more than 5 percentage points of GDP.

Country-specific external shocks. Terms of trade shocks are defined as a 10 percent worsening in the terms of trade for goods, based on WEO data. The dummy variable for disasters takes the value 1 if the number of injured times 0.3 plus the number of killed is greater than 0.01 percent of the country's total population; the data are drawn from EMDAT, and published by CRED (www.em-dat.net).

Socio-political shocks. Data from the Correlates of War project was used to construct a war dummy, which records a 1 in the first year of a war. Shocks to the political system are defined as a deterioration by 3 points or more in the Polity index published by the Polity IV project (see Marshall and Jaggers, 2002 for a definition of the variable). The data are drawn from http://www.cidcm.umd.edu/inscr/polity/ (Center for International Development and Conflict Management, University of Maryland; and Center for Global Policy, George Mason University).

Global shocks. The global interest rate shock takes the value 1 when the U.S. federal funds rate increases by more than 150 basis points in one year. Oil price shocks refer to the first year of these episodes (i.e., 1973, 1978, 1989, 1999), drawn from *World Economic Outlook*, Appendix 1.1, September 2004, International Monetary Fund.

Boom-bust cycles. Lending boom dates are drawn from Gourinchas, Valdés and Landerretche (2001, Table A1). The dummy variable takes the value 1 in the year after a lending boom ends. A growth boom is defined as a three-year period with average growth exceeding by two standard deviations the country's average growth rate estimated over the entire sample. The dummy variable takes the value 1 in the first year after such an episode.

II. ANNEX TO SECTION III: BEHAVIOR OF DIFFERENT TYPES OF FINANCIAL FLOW³⁰

Data Description

This Annex analyzes data on the financial account and six of its components: foreign direct investment (FDI); portfolio debt investment (PDI); portfolio equity investment (PEI); official flows (which include flows by government and monetary authorities); bank flows; and other investment, for 1970–2003. All flows are net, taken from IMF's Balance of Payments (BOP) database, and reported in current U.S. dollars. Throughout the analysis below, the flows are normalized by GDP in current U.S. dollars (taken primarily from the World Bank's World Development Indicators database, and supplemented with data from the IMF's World Economic Outlook database). All data were checked for quality, dropping outliers and unusable observations. The full sample includes 153 countries (Table 6), though only a subset of countries have reliable data for a sufficiently long time series.

Summary statistics

Average net flows

Considering the average financial account balance for each country in 1970–2003, and taking the cross-country median within each country group over the period, not surprisingly, developing countries had the largest net inflows, followed by emerging markets, and then advanced countries (Table 7). This pattern is even more pronounced for FDI, which has not been a net source of finance for advanced countries. By contrast, emerging markets received net FDI inflows averaging about 1.3 percentage points of GDP yearly, and developing countries received about 2.3 percentage points. The results (not reported for the sake of brevity) are similar when considering 1990–2003 only, suggesting that the relative importance of FDI as a source of net inflows for emerging and developing countries has not diminished in the last decade. All the main results highlighted in this Annex hold for the subperiod 1990–2003.

³⁰ The authors of this Annex are Andrei Levchenko and Paolo Mauro.

AustraliaArgentinaAlbaniaJamaicaAustriaBrazilAlgeriaKazakhstanBelgium-LuxembourgBulgariaAngolaKenyaCanadaChileAntigua and BarbudaKuwaitChina P.R. Hong KongChina P.R. MainlandArmeniaKyrgyz RepublicCyprusColombiaArubaLaó's Peoples Dem. Rep.DemmarkCote d'IvoireAzerbaijanLatviaFinlandCzech RepublicBahmans TheLesothoFranceDominican RepublicBahrain Kingdom ofLithuaniaGreeceEgyptBarbadosMadagascarIcelandEl SalvadorBelizeMalawiIrelandHungaryBelizeMaldivesIsraelIndiaBoriviaMauritaniaJapanJordanBotswanaMauritaniaNetwe ZealandMalaysiaCambodiaMoldovaNorwayMexicoCameroonMongoliaPortugalMoroccoCape VerdeMozambiqueSingaporeNigeriaComorosNetherlands AntillesSwitzerlandPanamaCongo Republic ofNicaraguaUnited KingdomPeruCosta RicaNigerUnited KingdomPeruCosta RicaNigerUnited KingdomPeruCosta RicaNigerUnited KingdomPeruCosta RicaNigerUnited KingdomPeruCosta RicaNigerUnited KingdomPeruCosta RicaNigerUnited Kingdom
AustriaBrazilAlgeriaKazakhstanBelgium-LuxembourgBulgariaAngolaKenyaCanadaChileAntigua and BarbudaKuwaitChina P.R. Hong KongChina P.R. MainlandArmeniaKyrgyz RepublicCyprusColombiaArubaLao's Peoples Dem. Rep.DenmarkCote d'IvoireAzerbaijanLatviaFinlandCzech RepublicBahrain Kingdom ofLithuaniaGrenceDominican RepublicBahrain Kingdom ofLithuaniaGreeceEgyptBarbadosMadagascarIcelandEl SalvadorBelarusMalawiIrelandHungaryBelizeMalivesIsraelIndiaBeninMaltaJapanJordanBoliviaMolovaNorwayMexicoCambodiaMolovaNorwayMexicoCambodiaMolovaSingaporeNigeriaComorosNetherlands AntillesSwitzerlandPanamaCongo Republic ofNicaraguaUnited KingdomPeruCosta RicaNigerUnited KingdomPeru
Belgium-LuxembourgBulgariaAngolaKenyaCanadaChileAntigua and BarbudaKuwaitChina P.R. Hong KongChina P.R. MainlandArmeniaKyrgyz RepublicCypusColombiaArubaLao's Peoples Dem. Rep.DenmarkCote d'IvoireAzerbaijanLatviaFinlandCzech RepublicBahamas TheLesothoFranceDominican RepublicBaharain Kingdom ofLithuaniaGermanyEcuadorBalgladeshMacedonia F.Y.R.GreeceEgyptBarbadosMalawiIrelandHungaryBelizeMalawiIsraelIndiaBeninMalitaJapanJordanBoliviaMaltaNetherlandsKoreaBurundiMauritaniaNew ZealandMalaysiaCameroonMongoliaPortugalMoroccoCape VerdeMozambiqueSingaporeNigeriaCentral African Rep.NamibiaSyainOmanChadNepalSwedenPakistanComorosNetherlands AntillesSwitzerlandPanamaCongo Republic ofNicaraguaUnited KingdomPeruCosta RicaNigerUnited KingdomPeruCosta RicaNaguayRussiaEstoniaRomaniaParaguay
CanadaChileAntigua and BarbudaKuwaitChina P.R. Hong KongChina P.R. MainlandArmeniaKyrgyz RepublicCyprusColombiaArubaLao's Peoples Dem. Rep.DenmarkCote d'IvoireAzerbaijanLatviaFinlandCzech RepublicBahamas TheLesothoFranceDominican RepublicBahrain Kingdom ofLithuaniaGermanyEcuadorBalgladeshMacedonia F.Y.R.GreeceEgyptBarbadosMalawiIrelandHungaryBelizeMaldivesIsraelIndiaBeninMaltaJapanJordanBoliviaMaltaJapanJordanBotswanaMauritaniaNew ZealandMalaysiaCameroonMongoliaPortugalMoroccoCape VerdeMozambiqueSingaporeNigeriaComorosNetherlands AntillesSwedenPakistanComorosNetherlands AntillesSwitzerlandPanamaCongo Republic ofNicaraguaUnited KingdomPeruCosta RicaNigerUnited KingdomPeruCosta RicaNigerUnited KingdomPeruCosta RicaNigerUnited StatesPhilippinesCroatiaParaguayRussiaEstoniaRomaniaParaguayKusaiEstoniaFeruinaRomaniaSwitzerlandPeruCosta RicaNigerUnited KingdomFeruCosta RicaNigerUnited Kingdom <td< td=""></td<>
China P.R. Hong KongChina P.R. MainlandArmeniaKyrgyz RepublicCyprusColombiaArubaLao's Peoples Dem. Rep.DenmarkCote d'IvoireAzerbaijanLatviaFinlandCzech RepublicBahamas TheLesothoFranceDominican RepublicBahrain Kingdom ofLithuaniaGermanyEcuadorBangladeshMacedonia F.Y.R.GreeceEgyptBarbadosMalawiIcelandEl SalvadorBelarusMalawiIrelandHungaryBelizeMaldivesIsraelIndiaBoninMaltaJapanJordanBotswanaMauritaniaNetherlandsKoreaBurundiMoldovaNorwayMexicoCameroonMongoliaPortugalMoroccoCape VerdeMozambiqueSingaporeNigeriaComorosNetherlands AntillesSwitzerlandPanamaConorosNetherlands AntillesSwitzerlandPanamaConorosNetherlands AntillesSwitzerlandPanamaConorosNetherlands AntillesSwitzerlandPanamaConorosNetherlands AntillesSwitzerlandPanamaConorosNetherlands AntillesSwitzerlandPanamaCroatiaPapua New GuineaPolandDominicaParaguayRussiaSwitzerlandPeruCosta RicaNigerUnited KingdomPeruEriatiaParaguaySwitzerlandPolandDominicaParaguay
CyprusColombiaArubaLao's Peoples Dem. Rep.DenmarkCote d'IvoireAzerbaijanLatviaFinlandCzech RepublicBahamas TheLesothoFranceDominican RepublicBahrain Kingdom ofLithuaniaGermanyEcuadorBangladeshMacedonia F.Y.R.GreeceEgyptBarbadosMadagascarIcelandEl SalvadorBelarusMalawiIrelandHungaryBelizeMaldivesIsraelIndiaBeninMaltiIatlyIndonesiaBoliviaMaltraJapanJordanBotswanaMauritaniaNetherlandsKoreaBurundiMoldovaNorwayMexicoCameroonMongoliaSingaporeNigeriaComorosNetherlands AntillesSpainOmanChadNepalSwitzerlandPanamaCongo Republic ofNicaraguaUnited KingdomPeruCosta RicaNigerUnited StatesPhilippinesCroatiaPanguayKusiaEstoniaRicaRomania
DenmarkCote d'IvoireAzerbaijanLatviaFinlandCzech RepublicBahamas TheLesothoFranceDominican RepublicBahrain Kingdom ofLithuaniaGermanyEcuadorBangladeshMacedonia F.Y.R.GreeceEgyptBarbadosMadagascarIcelandEl SalvadorBelarusMalawiIrelandHungaryBelizeMaldivesIsraelIndiaBeninMaltaItalyIndonesiaBoliviaMauritaniaNetherlandsKoreaBurundiMauritaniaNetwayMexicoCameroonMoldovaNorwayMexicoCameroonMoldovaSpainOmanChadNepalSpainOmanChadNepalSwedenPakistanComorosNetherlands AntillesSwitzerlandPeruCosta RicaNigerUnited KingdomPeruCosta RicaNigerUnited StatesPhilippinesCroatiaParaguayRussiaEstoniaRomaniaParaguay
FinlandCzech RepublicBahamas TheLesothoFranceDominican RepublicBahrain Kingdom ofLithuaniaGermanyEcuadorBangladeshMacedonia F.Y.R.GreeceEgyptBarbadosMadagascarIcelandEl SalvadorBelarusMalawiIrelandHungaryBelizeMaldivesIsraelIndiaBeninMaliItalyIndonesiaBoliviaMataJapanJordanBotswanaMauritaniaNetherlandsKoreaBurundiMoldovaNorwayMexicoCameroonMongoliaPortugalOmanChadNepalSpainOmanComorosNetherlands AntillesSwedenPakistanComorosNetherlands AntillesSwitzerlandPanamaCongo Republic ofNicaraguaUnited KingdomPeruCosta RicaNigerUnited StatesPhilippinesCroatiaPapua New GuineaPolandDominicaParaguayParaguaySwaiaEstoniaEstoniaRomania
FranceDominican RepublicBahrain Kingdom ofLithuaniaGermanyEcuadorBangladeshMacedonia F.Y.R.GreeceEgyptBarbadosMadagascarIcelandEl SalvadorBelarusMalawiIrelandHungaryBelizeMaldivesIsraelIndiaBeninMaltaIapanJordanBotswanaMauritaniaNetherlandsKoreaBurundiMoldovaNorwayMexicoCameoonMongoliaPortugalMoroccoCape VerdeMozambiqueSingaporeNigeriaComorosNetherlands AntillesSwitzerlandPanamaCongo Republic ofNicaraguaSwitzerlandPanamaCongo Republic ofNicaraguaUnited KingdomPeruCosta RicaNigerUnited StatesPhilippinesCroatiaParaguayRussiaEstoniaRomaniaParaguay
GermanyEcuadorBangladeshMacedonia F.Y.R.GreeceEgyptBarbadosMadagascarIcelandEl SalvadorBelarusMalawiIrelandHungaryBelizeMaldivesIsraelIndiaBeninMaliItalyIndonesiaBoliviaMaltaJapanJordanBotswanaMauritianiaNetherlandsKoreaBurundiMauritiusNew ZealandMalaysiaCambodiaMoldovaNorwayMexicoCameroonMongoliaSingaporeNigeriaCentral African Rep.NamibiaSpainOmanChadNepalSwedenPanamaCongo Republic ofNicaraguaUnited KingdomPeruCosta RicaNigerUnited StatesPhilippinesCroatiaPangua New GuineaPolandDominicaParaguayRussiaSaudi ArabiaEstoniaRomaniaRomania
GreeceEgyptBarbadosMadagascarIcelandEl SalvadorBelarusMalawiIrelandHungaryBelizeMaldivesIsraelIndiaBeninMaliItalyIndonesiaBoliviaMaltaJapanJordanBotswanaMauritaniaNetherlandsKoreaBurundiMauritiusNew ZealandMalaysiaCambodiaMoldovaNorwayMexicoCameroonMongoliaPortugalMoroccoCape VerdeMozambiqueSingaporeNigeriaComorosNetherlands AntillesSwedenPakistanCongo Republic ofNicaraguaUnited KingdomPeruCosta RicaNigerUnited StatesPhilippinesCroatiaPapua New GuineaRussiaEstoniaEstoniaRomaniaSaudi ArabiaEstoniaRusaniaRusania
IcelandEl SalvadorBelarusMalawiIrelandHungaryBelizeMaldivesIsraelIndiaBeninMaliItalyIndonesiaBoliviaMaltaJapanJordanBotswanaMauritaniaNetherlandsKoreaBurundiMauritiusNew ZealandMalaysiaCambodiaMoldovaNorwayMexicoCameroonMongoliaPortugalMoroccoCape VerdeMozambiqueSingaporeNigeriaCentral African Rep.NamibiaSwedenPakistanComorosNetherlands AntillesSwitzerlandPeruCosta RicaNigerUnited KingdomPeruCroatiaPapua New GuineaPolandDominicaParaguayRussiaEstoniaRomaniaSaudi ArabiaEijiPuvanda
IrelandHungaryBelizeMaldivesIsraelIndiaBeninMaliItalyIndonesiaBoliviaMaltaJapanJordanBotswanaMauritaniaNetherlandsKoreaBurundiMauritiusNew ZealandMalaysiaCambodiaMoldovaNorwayMexicoCameroonMongoliaPortugalMoroccoCape VerdeMozambiqueSingaporeNigeriaCentral African Rep.NamibiaSwedenPakistanComorosNetherlands AntillesSwitzerlandPeruCosta RicaNigerUnited KingdomPeruCroatiaPapua New GuineaPolandDominicaParaguayRussiaKussiaEstoniaRomaniaRomania
IsraelIndiaBeninMaliItalyIndonesiaBoliviaMaltaJapanJordanBotswanaMauritaniaNetherlandsKoreaBurundiMauritiusNew ZealandMalaysiaCambodiaMoldovaNorwayMexicoCameroonMongoliaPortugalMoroccoCape VerdeMozambiqueSingaporeNigeriaCentral African Rep.NamibiaSwedenPakistanComorosNetherlands AntillesSwitzerlandPanamaCongo Republic ofNicaraguaUnited KingdomPeruCosta RicaNigerUnited StatesPhilippinesCroatiaParaguayRussiaEstoniaRomaniaRomania
ItalyIndonesiaBoliviaMaltaJapanJordanBotswanaMauritaniaNetherlandsKoreaBurundiMauritiusNew ZealandMalaysiaCambodiaMoldovaNorwayMexicoCameroonMongoliaPortugalMoroccoCape VerdeMozambiqueSingaporeNigeriaCentral African Rep.NamibiaSpainOmanChadNepalSwedenPakistanComorosNetherlands AntillesSwitzerlandPeruCosta RicaNigerUnited KingdomPeruCroatiaPapua New GuineaPolandDominicaParaguayRomaniaKussiaEstoniaEstoniaRomania
JapanJordanBotswanaMauritaniaNetherlandsKoreaBurundiMauritiusNew ZealandMalaysiaCambodiaMoldovaNorwayMexicoCameroonMongoliaPortugalMoroccoCape VerdeMozambiqueSingaporeNigeriaCentral African Rep.NamibiaSpainOmanChadNepalSwedenPakistanComorosNetherlands AntillesSwitzerlandPeruCosta RicaNigerUnited KingdomPeruCroatiaPapua New GuineaPolandDominicaParaguayRussiaSwai ArabiaEijiPuvanda
NetherlandsKoreaBurundiMauritiusNew ZealandMalaysiaCambodiaMoldovaNorwayMexicoCameroonMongoliaPortugalMoroccoCape VerdeMozambiqueSingaporeNigeriaCentral African Rep.NamibiaSpainOmanChadNepalSwedenPakistanComorosNetherlands AntillesSwitzerlandPeruCosta RicaNigerUnited KingdomPeruCroatiaPapua New GuineaPolandDominicaParaguayRussiaSwai ArabiaEijiPwanda
New ZealandMalaysiaCambodiaMoldovaNorwayMexicoCameroonMongoliaPortugalMoroccoCape VerdeMozambiqueSingaporeNigeriaCentral African Rep.NamibiaSpainOmanChadNepalSwedenPakistanComorosNetherlands AntillesSwitzerlandPeruCosta RicaNigerUnited KingdomPeruCroatiaPapua New GuineaPolandDominicaParaguayRussiaEstoniaRomania
NorwayMexicoCameroonMongoliaPortugalMoroccoCape VerdeMozambiqueSingaporeNigeriaCentral African Rep.NamibiaSpainOmanChadNepalSwedenPakistanComorosNetherlands AntillesSwitzerlandPanamaCongo Republic ofNicaraguaUnited KingdomPeruCosta RicaNigerUnited StatesPhilippinesCroatiaPapua New GuineaPolandDominicaParaguayRussiaEstoniaRomania
PortugalMoroccoCape VerdeMozambiqueSingaporeNigeriaCentral African Rep.NamibiaSpainOmanChadNepalSwedenPakistanComorosNetherlands AntillesSwitzerlandPanamaCongo Republic ofNicaraguaUnited KingdomPeruCosta RicaNigerUnited StatesPhilippinesCroatiaPapua New GuineaPolandDominicaParaguayRussiaEstoniaRomania
SingaporeNigeriaCentral African Rep.NamibiaSpainOmanChadNepalSwedenPakistanComorosNetherlands AntillesSwitzerlandPanamaCongo Republic ofNicaraguaUnited KingdomPeruCosta RicaNigerUnited StatesPhilippinesCroatiaPapua New GuineaPolandDominicaParaguayRussiaEstoniaRomaniaSaudi ArabiaFijiRwanda
SpainOmanChadNepalSwedenPakistanComorosNetherlands AntillesSwitzerlandPanamaCongo Republic ofNicaraguaUnited KingdomPeruCosta RicaNigerUnited StatesPhilippinesCroatiaPapua New GuineaPolandDominicaParaguayRussiaEstoniaRomaniaSaudi ArabiaFijiRwanda
SwedenPakistanComorosNetherlands AntillesSwitzerlandPanamaCongo Republic ofNicaraguaUnited KingdomPeruCosta RicaNigerUnited StatesPhilippinesCroatiaPapua New GuineaPolandDominicaParaguayRussiaEstoniaRomaniaSaudi ArabiaFijiRwanda
SwitzerlandPanamaCongo Republic ofNicaraguaUnited KingdomPeruCosta RicaNigerUnited StatesPhilippinesCroatiaPapua New GuineaPolandDominicaParaguayRussiaEstoniaRomaniaSaudi ArabiaFijiRwanda
United KingdomPeruCosta RicaNigerUnited StatesPhilippinesCroatiaPapua New GuineaPolandDominicaParaguayRussiaEstoniaRomaniaSaudi ArabiaFijiRwanda
United States Philippines Croatia Papua New Guinea Poland Dominica Paraguay Russia Estonia Romania Saudi Arabia Fiji
Poland Dominica Paraguay Russia Estonia Romania Saudi Arabia Eiji Rwanda
Russia Estonia Romania Saudi Arabia Fiji Rwanda
Saudi Arabia Fiji Bwanda
Nauu Alabia Fill Nwalua
Slovak Republic Gabon Sao Tome Principe
South Africa Gambia. The Senegal
Sri Lanka Georgia Sevchelles
Thailand Ghana Sierra Leone
Tunisia Grenada Slovenia
Turkey Guatemala Solomon Islands
Ukraine Guinea Sudan
Uruguay Guyana Swaziland
Venezuela Rep Bol Haiti Svrian Arab Republic
Zimbabwe Honduras Tanzania
Толо
Tanga
Trinidad and Tobago
Honda and Tobago
Vanuatu
Vietnam

Table 6.	Economies	by	Group
----------	-----------	----	-------

Note: Advanced countries are defined as in the IMF's *World Economic Outlook*, except for Korea which for the purpose of the empirical analysis is classified as emerging rather than advanced to capture the experience of its 1997–98 crisis; the remaining countries are considered emerging if they are included in either the (stock market based) International Financial Corporation's Major Index (2005) or JPMorgan's EMBI Global Index (2005) (which includes countries that issue bonds on international markets); the remaining countries are classified as developing.

	Financial account	FDI	PDI	PEI	Official Flows	Bank Flows	Other Investment
Average of Capital Flows							
Advanced	1.34	0.07	0.25	-0.20	0.01	0.41	0.10
Emerging	2.12	1.30	0.21	0.15	0.10	0.01	0.04
Developing	3.15	2.24	-0.07	0.00	0.86	-0.14	0.57
Volatility (Standard Deviation)							
Advanced	2.88	1.35	2.09	1.56	0.80	2.31	1.86
Emerging	4.38	1.50	1.20	0.63	1.89	1.32	1.95
Developing	4.55	2.11	0.92	0.33	2.22	1.14	1.90
Volatility (Coefficient of Variation)							
Advanced	1.34	2.22	2.28	3.25	2.66	5.02	5.55
Emerging	1.83	1.00	3.18	1.96	3.16	7.22	3.61
Developing	1.32	0.92	3.07	2.14	2.39	3.62	2.15
Persistence (AR1 Pooled)							
Advanced	0.68	0.33	0.35	0.37	0.40	0.37	0.41
Emerging	0.52	0.51	0.02	0.39	0.42	0.11	0.47
Developing	0.51	0.35	0.51	0.41	0.48	0.17	0.37
Correlation with Domestic Growth							
Advanced	0.08	-0.02	-0.10	0.03	-0.02	0.17	-0.02
Emerging	0.23	0.10	-0.03	0.09	-0.03	0.17	0.20
Developing	0.15	0.17	-0.08	0.03	-0.02	0.04	0.11
Correlation with G7 Growth							
Advanced	0.03	0.00	-0.01	0.00	-0.01	0.02	-0.01
Emerging	-0.09	-0.09	-0.09	0.11	-0.04	-0.07	-0.06
Developing	0.02	0.02	0.01	0.22	0.03	-0.02	-0.01
Correlation with US 1 year Tbill							
Advanced	0.24	0.08	0.07	0.09	0.03	0.00	0.16
Emerging	0.08	-0.29	-0.06	0.08	0.27	0.02	0.13
Developing	0.07	-0.16	0.02	0.15	0.21	0.02	0.04
First Principal Component							
Advanced	0.30	0.36	0.23	0.37	0.20	0.27	0.19
Emerging	0.24	0.40	0.28	0.34	0.25	0.19	0.21
Developing	0.28	0.32	0.36	0.35	0.27	0.17	0.18

Table 7. Financial Account and its Sub-Components, 1970-2003

Sources: Balance of Payments Statistics, IMF (all financial flows); World Development Indicators, World Bank and World Economic Outlook, IMF (GDP). See the text for details.

Notes: The data reported are medians across countries within each group. All flows are net and normalized by total GDP for each year. The coefficient of variation of a series is the standard deviation divided by the mean: it is computed for each country separately, and this table reports the median across countries. The measure of persistence is the slope coefficient in a regression of a variable on its lagged value. The first principal component is a measure of comovement across countries within each group: it is the share of total variance in a set of series that can be explained by a common component.

Volatility

Using the standard deviation of net flows as a measure of volatility, financial flows are found to be substantially more volatile in emerging and developing countries. The cross-country median of the standard deviation of the financial account is about 2.9 percentage points of GDP for advanced countries in 1970-2003, and about 4.5 percentage points for emerging markets and developing countries. This corroborates findings by previous studies (Broner and Rigobon, 2004; Prasad and others, 2003). The ranking by standard deviation is the same for FDI and official flows. However, both PDI and PEI are 2 and 5 times more volatile in advanced countries than in developing countries, respectively, with emerging market countries somewhere in-between. Comparing across flows, FDI is the least volatile type of flow in advanced countries, with the exception of official flows. For emerging markets, on the other hand, FDI is more volatile than PDI or PEI. For developing countries, official flows are the most volatile, followed closely by FDI. Comparing across flows, it is important to take into account the size of the various types of flow, by using the coefficient of variation. On that basis, FDI is the most stable of all flows to emerging and developing countries, with a coefficient of variation near 1, compared to 2-3 for PDI and PEI, or 5-7 for official flows, bank flows, and other investment (see also Wei, 2001).³¹

Persistence

On the persistence properties of financial flows, autoregressive coefficients were calculated on pooled data for each relevant country group, using a fixed effects regression with the first lag on the right-hand side.³² The financial account exhibits similar autoregressive properties for emerging markets and developing countries, with the AR(1) coefficient estimated at around 0.5. The financial account is more persistent in advanced countries, with an autoregressive coefficient of 0.7. Interestingly, for advanced countries, the AR(1) coefficient is also quite similar across flows, ranging between 0.3–0.4. For emerging markets, the most persistent type of flow is FDI, with an AR(1) coefficient of 0.5; and the least persistent is PDI, with a coefficient of virtually zero. For developing countries, FDI has an AR(1) coefficient of 0.35, with the coefficients for PDI, PEI, and other flows lying between 0.2 and 0.5. These estimates are close to those in Obstfeld and Taylor (2004) and Broner and Rigobon (2004), though the latter argue that total financial flows are more persistent in emerging and developing countries.

 32 Alternatively, AR(1) regressions were estimated for each country separately. The disadvantage of the pooled approach is that it constrains the AR(1) coefficient to be the same for each country group. The advantage is that it allows for inclusion of countries for which only a short time series is available. Results were similar to those reported here.

³¹ One possible problem with calculating the coefficient of variation is that average net inflows are often quite close to zero. To check robustness, two alternative measures of relative volatility were calculated. First, the coefficient of variation was calculated for gross financial inflows. Second, the standard deviation of net flows was normalized by the average gross flows. The conclusions are virtually the same.

Correlations

Table 7 also reports correlations of financial flows with domestic GDP growth, G7 growth, and U.S. interest rate (the 1-year T-bill rate). Correlations between financial flows and these variables turn out to be quite low, except as noted below. Financial flows are mildly procyclical in emerging market and developing countries. In developing countries, FDI is the financial flow most correlated with growth, though the correlation is still low at 0.2. For emerging markets, most procyclical are official flows and other investment. A positive correlation between financial flows and growth has also been reported by Albuquerque and others (2005). The only type of flow that exhibits significant correlation with G7 growth is PEI for emerging markets (0.1) and developing countries (0.2). The U.S. interest rate is correlated with the inflows into advanced countries, with a coefficient of 0.2, and is virtually uncorrelated with the financial account of emerging and developing countries. FDI is negatively correlated with the U.S. interest rate, in both emerging markets (correlation of -0.3) and developing countries (correlation of -0.16). Other studies, such as Fernandez-Arias (1996), find that foreign interest rates do matter for financial flows, using higher frequency data for shorter time periods. The present exercise shows that at yearly frequency foreign interest rates matter less, a result also found in Broner and Rigobon (2004). Different kinds of financial flow are also uncorrelated or weakly negatively correlated with each other, a pattern that holds for all country groups, a finding consistent with Claessens and others (1995). This may suggest that different types of flows may be substitutes rather than complements, or that reclassifications are frequent.

Principal components analysis

The interrelationships of financial flows across regions and income groups were analyzed using principal components analysis, focusing on the share of variation explained by the first principal component for each country group or region. For total financial flows, the patterns across developed and developing countries are quite similar, with the first principal component accounting for 25–30 percent of the variation in financial flows. Comparing across flows, FDI and PEI display the largest common component for advanced countries; for emerging markets, FDI has the largest common component; for developing countries, FDI, PDI, and PEI are roughly similar in this respect. Overall, however, there are no pronounced differences across types of flows in the relative importance of the common component can account for 60–80 percent of variation in financial flows, their use of monthly data for a shorter time span (four years) on a Latin American sample may explain the difference in results.

III. ANNEX TO SECTION IV: A MODEL OF OPTIMAL RESERVES

This Annex presents background information on the Jeanne-Rancière (2005) model of a growing open economy where reserves are accumulated, at a cost, in order to reduce the frequency of sudden stops in financial flows and smooth their impact on domestic consumption. The simple version of the model presented in this study only considers the smoothing role of reserves. At the time of a sudden stop, the country's authorities lend reserves to domestic agents whose lines of credit have been cut off by private lenders, thereby mitigating the drop in domestic consumption. The cost of holding reserves (the difference between the return on reserves and the long-term interest rate) translates into lower domestic consumption during non-crisis times. The optimal level of reserves equates the marginal costs and benefits of holding reserves. The parameters of the benchmark calibration (Table 8) are based on information drawn from a panel of 33 middle-income countries in 1980-2003. Defining a sudden stop as a worsening in the financial account balance by more than 5 percent of GDP, 77 sudden stops are observed during the sample period. This yields an unconditional probability of a sudden stop of 10 percent per year. The magnitude of a sudden stop is the mean size of sudden stops in the sample (11 percentage points of GDP). The output cost of a sudden stop is set equal to 6 percent of GDP (the difference in average real GDP growth between, on the one hand, the year of the sudden stop and the following year, and on the other hand, remaining years for all countries).

Parameters	Baseline	Range of Variation
Size of Sudden Stop	$\lambda = 0.11$	[0,0.3]
Probability of a Sudden Stop	$\pi = 0.10$	[0,0.25]
Output Loss	$\gamma = 0.06$	[0,0.2]
Potential Output Growth	g = 0.033	
Term Premium	$\delta = 0.015$	[0.0025, 0.05]
Risk Free Rate	r* = 0.05	
Risk Aversion	$\sigma = 2$	[1,10]

Table 8.	Calibration	Parameters
----------	-------------	------------

Source: Staff calculations using data from the Federal Reserve Board and the IMF's *International Financial Statistics*.

The cost of holding reserves is the difference between the opportunity cost of borrowing long term and the return on reserves invested in short-term liquid safe assets. In the benchmark calibration this premium consists only of the term premium, set at 1.5 percent, that is, the mean difference between the yield on 10 year US Treasury bonds and the federal funds rate in 1987–2005. Variants of the model consider the case where the opportunity cost of holding reserves also includes the sovereign spread. The coefficient of risk aversion is allowed to vary in the 1–10 range, as customary in existing studies on growth and business cycles. It is assumed that the authorities are benevolent and maximize the welfare of the representative

domestic consumer. The risk-free rate is set at 5 percent. The potential output growth rate is set at 3.3 percent, the mean real GDP growth rate in middle-income countries over 1980-2003, excluding sudden stop years.

To analyze the role of the parameters in determining the optimal level of reserves, the model is repeatedly simulated letting each key parameter vary (one at a time) over a plausible range, while keeping the other parameters fixed at their baseline values as in Table 8. For the sake of comparison, in each plot (Figure 9) the optimal level of reserves is presented alongside the level of reserves predicted by the Greenspan-Guidotti rule.





Source: IMF Staff Calculations.

When the size or probability of a sudden stop is sufficiently low, the optimal ratio of reserves is zero. (The costs of reserves exceed their benefits.) Optimal reserves rise near-linearly as the size of the sudden stop increases (beyond 2.5 percent of GDP), and non-linearly as the probability of a sudden stop increases. For some starting values of the sudden stop probability, a relatively modest rise can imply a substantial adjustment in the optimal ratio of reserves to GDP: for example, an increase in the annual probability from 5 to 10 percent leads optimal reserves to rise from 4 to 10 percentage points of GDP. Changes in the opportunity cost of holding reserves (regardless of whether they stem from a change in the term premium or, when included, the sovereign spread) have a substantial impact on optimal reserve levels. For example, an increase in the opportunity cost by 1.5 percentage points of GDP. Finally, the impact of changes in the degree of risk aversion on the optimal level of reserves is major when starting from relatively low values of the coefficient, but limited when starting from higher values.

The determinants of vulnerability to sudden stops

The probability of a sudden stop can be estimated as a function of a country's economic fundamentals by running a probit estimation of the probability of sudden stops in a sample of 33 middle income countries over 1980-2003. The explanatory variables are selected using a general-to-specific approach, that is, by initially considering a large set of potential explanatory variables and iteratively eliminating those that are statistically less significant to arrive at the preferred specification reported in Table 9. The complete set of variables considered is listed in Jeanne and Rancière (2005). All explanatory variables are averages of the first and second lags, and are thus predetermined with respect to the sudden stop. The results are robust to the inclusion of time effects, and fixed effects.

The probability of a sudden stop decreases with the pre-crisis growth performance and increases with the currency's real appreciation, the ratio of public debt to GDP, openness to financial flows and the ratio of foreign liabilities to money in the banking sector.³³ The last two determinants suggest that the vulnerability to sudden stops rises with the degree of international financial integration.³⁴ A fixed exchange rate regime is associated with a higher probability of a sudden stop, though only if financial openness and exchange rate overvaluation are omitted from the regression.

³³ The ratio of foreign liabilities of the financial sector to money in the banking sector (IFS line 26C/line 34) is a reasonable proxy for, though not a direct measure of, mismatch in the currency denomination of assets and liabilities in countries' balance sheets. It is available for almost all countries since 1970.

³⁴ We find that trade openness does not significantly affect the probability of a sudden stop when financial openness is included as an explanatory variable.

	(1)	(2)	(3)	(4)	(5)
Real Effective Exchange Rate	1.52		1.52	1.85	1.78
Deviation from HP-trend	(3.1)***		(2.9)***	(3.4)***	(3.1)***
GDP Growth	-1.25 (1.6)*		-1.56 (1.7)*	-1.42 (1.7)*	-1.87 (1.8)*
Public Debt/GDP	0.81	0.78	0.72	1.02	0.85
	(3.3)***	(3.5)***	(2.6)***	(2.4)**	(1.6)
Ratio of Foreign Liabilities to Money	0.23	0.20	0.22	0.22	0.20
in the Banking Sector	(3.0)***	(2.7)***	(2.8)***	(2.2)**	(1.9)*
Financial Openness as	9.11		10.04	9.82	11.15
(Gross Inflows)/GDP	(5.7)***		(5.5)***	(4.9)***	(4.9)***
Dummy for Fixed Exchange Rate Regime		0.29 (1.8)*			
Constant	-2.31 (12.6)***	-1.80 (12.9)***	-2.41 (5.3)***		
Observations Pseudo R2	707 0.14	690 0.06	707 0.17	537	537
Time Effects	No	No	Yes	No	Yes
Fixed Effects	No	No	No	Yes	Yes

Table 9. Probit Estimation of the Probability of a Sudden Stop

Sources: *International Financial Statistics*, IMF; *Global Development Finance*, World Bank; and staff calculations. Notes: *significant at 10%; **significant at 5%; ***significant at 1%. Absolute value of z statistics in parentheses. All explanatory variables are taken as average of first and second lags. Fixed exchange rate regime is a "fix" or "peg" in the Reinhart and Rogoff (2004) classification.

REFERENCES

- Aizenman, Joshua, Yeonho Lee, and Yeongseop Rhee, 2004, "International Reserves Management and Capital Mobility in a Volatile World: Policy Considerations and a Case Study of Korea," NBER Working Paper No. 10534 (Cambridge, Massachusetts: National Bureau of Economic Research).
- ———, and Jaewoo Lee, 2005, "International Reserves: Precautionary Vs. Mercantilist Views, Theory and Evidence," IMF Working Paper 05/198 (Washington: International Monetary Fund).
- Albuquerque, Rui, Norman Loayza, and Luis Serven, 2005, "World Market Integration through the Lens of Foreign Direct Investors," *Journal of International Economics*, Vol. 66, pp. 267–295.
- Becker, Torbjörn, and Paolo Mauro, 2006, "Output Drops and the Shocks that Matter," IMF Working Paper 06/172 (Washington: International Monetary Fund).
- Bell, James, and Darren Pain, 2000, "Leading Indicator Models of Banking Crises—A Critical Review," *Financial Stability Review* (Bank of England) Issue 9 (December) pp. 113–29.
- Ben-Bassat, Avraham and Daniel Gottlieb, 1992, "Optimal International Reserves and Sovereign Risk," *Journal of International Economics*, Vol. 33, pp. 345–62.
- Berg, Andy, Eduardo Borenzstein, and Catherine Pattillo, 2004, "Assessing Early Warning Systems: How Have They Worked in Practice," IMF Working Paper 04/152 (Washington: International Monetary Fund).
- Borensztein, Eduardo, Marcos Chamon, Olivier Jeanne, Paolo Mauro, and Jeromin Zettelmeyer, 2004, *Sovereign Debt Structure for Crisis Prevention*, IMF Occasional Paper No. 237 (Washington: International Monetary Fund).
- Borensztein, Eduardo, and Paolo Mauro, 2004, "The Case for GDP-Indexed Bonds," *Economic Policy*, Vol. 38, pp. 165–216.
- Broner, Fernando, and Roberto Rigobon, 2004, "Why are Capital Flows so much more Volatile in Emerging than in Developed Countries?" Economics Working Papers 862, (Barcelona, Spain: Universitat Pompeu Fabra).
- Bulíř, Aleš, and A. Javier Hamann, 2003, "Aid Volatility: An Empirical Assessment," *Staff Papers*, International Monetary Fund, Vol. 50, No. 1, pp. 64–89.

- Bussiere, Matthieu, and Christian Mulder, 1999, "External Vulnerability in Emerging Market Economies: How High Liquidity Can Offset Weak Fundamentals and the Effects of Contagion," IMF Working Paper 99/88 (Washington: International Monetary Fund).
- Caballero, Ricardo J., and Stavros Panageas, 2005, "A Quantitative Model of Sudden Stops and External Liquidity Management," NBER Working Paper No. 11293 (Cambridge, Massachusetts: National Bureau of Economic Research).
- ——, 2004, "Contingent Reserves Management: An Applied Framework," Working Paper No. 04-32, (Cambridge, Massachusetts: MIT, Department of Economics).
- Calomiris, Charles, 1998, "Blueprints for a New Global Financial Architecture," *Compendium of Studies on International Economic Issues*, Joint Economic Committee of the U.S. Congress, 105th Congress, Second Session, October.
- Calvo, Guillermo, Leonardo Leiderman, and Carmen Reinhart, 1993, "Capital Inflows and the Real Exchange Rate Appreciation in Latin America," *Staff Papers*, International Monetary Fund, Vol. 40, pp. 108–51.
- Caprio, Gerard, and Daniela Klingebiel, 2003, "Episodes of Systemic and Borderline Financial Crises," World Bank Research Dataset.
- Chamon, Marcos, and Paolo Mauro, 2005, "Pricing Growth-Indexed Bonds," IMF Working Paper 05/216; forthcoming, *Journal of Banking and Finance*.
- Claessens, Stijn, Michael P. Dooley, and Andrew Warner, 1995, "Portfolio Capital Flows: Hot or Cold?" *The World Bank Economic Review*, Vol. 9. No. 1, pp. 153–74.
- Cordella, Tito and Eduardo Levy-Yeyati, 2005, "A (New) Country Insurance Facility," IMF Working Paper 05/23 (Washington: International Monetary Fund).
- Council on Foreign Relations Task Force, 1999, *Safeguarding Prosperity in a Global Financial System: The Future International Financial Architecture* (Washington: Institute for International Economics).
- Demirguc-Kunt, Asli, and Enrica Detragiache, 2005, "Cross-Country Empirical Studies of Systemic Bank Distress: A Survey," *National Institute Economic Review*, No. 192 (April) pp. 68–83.
- Detragiache, Enrica, and Antonio Spilimbergo, 2001, "Crises and Liquidity: Evidence and Interpretation," IMF Working Paper 01/2 (Washington: International Monetary Fund).

- Dooley, Michael P., David Folkerts-Landau, and Peter Garber, 2004, "The Revived Bretton Woods System: The Effects of Periphery Intervention and Reserve Management on Interest Rates and Exchange Rates in Center Countries," NBER Working Paper No. 10332 (Cambridge, Massachusetts: National Bureau of Economic Research).
- Fan, Joseph P. H., Sheridan Titman, and Garry Twite, 2003, "An International Comparison of Capital Structure and Debt Maturity Choices," Working Paper, University of Texas at Austin.
- Faria, André, and Paolo Mauro, 2004, "Institutions and the External Capital Structure of Countries," IMF Working Paper 04/236 (Washington: International Monetary Fund).
- Fernandez-Arias, Eduardo, 1996, "The New Wave of Private Capital Flows: Push or Pull?" Journal of Development Economics, Vol. 48, pp. 389–418.
- Flood, Robert, and Nancy Marion, 2002, "Holding International Reserves In an Era of High Capital Mobility," *Brookings Trade Forum 2001*, No. 1, pp. 1–68.
- Frankel, Jeffrey A., and Andrew Rose, 1996, "Currency Crashes in Emerging Markets: An Empirical Treatment," *Journal of International Economics*, Vol. 41, pp. 351–66.
- Frenkel, Jacob, and Boyan Jovanovic, 1981, "Optimal International Reserves: A Stochastic Framework," *Economic Journal*, Vol. 91, pp. 507–14.
- Garcia, Pablo S., and Claudio Soto, 2004, "Large Hoarding of International Reserves: Are They Worth It?" Working Papers Central Bank of Chile 299, (Santiago, Chile: Central Bank of Chile).
- Gelb, Alan, and Benn Eifert, 2005, "Improving the Dynamics of Aid: Toward More Predictable Budget Support," (unpublished; Washington: The World Bank).
- Genberg, Hans, Robert McCauley, Yung Chul Park, and Avinash Persaud, 2005, "Official Reserves and Currency Management in Asia: Myth, Reality and the Future," Geneva Reports on the World Economy No. 7 (London: Centre for Economic Policy Research).
- Ghosh, Atish, Anne Marie Gulde, and Holger Wolf, 2002, *Exchange Rate Regime: Choice and Consequences* (Cambridge, Massachusetts: MIT Press).
- Goldstein, Morris, 2004, "Adjusting China's Exchange Rate Policies," Working Paper No. 04-1 (Washington: Institute for International Economics).
- Gourinchas, Pierre-Olivier, Rodrigo Valdes and Oscar Landerretche, 2001, "Lending Booms: Latin America and the World," *Economia*, Vol. 1, No. 2, pp. 47–99.

- Guscina, Anastasia, and Olivier Jeanne, 2006, "The Structure of Government Debt in Emerging Market Countries: A New Data Set," IMF Working Paper 06/98 (Washington: International Monetary Fund).
- Hauner, David, 2005, "A Fiscal Price Tag for International Reserves," IMF Working Paper 05/81 (Washington: International Monetary Fund).
- Honohan, Patrick, and Anqing Shi, 2002, "Deposit Dollarization and the Financial Sector in Emerging Economies," World Bank Working Paper No. 2748 (Washington: World Bank).
- Hviding, Ketil, Michael Nowak, and Luca Antonio Ricci, 2004, "Can Higher Reserves Help Reduce Exchange Rate Volatility?" IMF Working Paper 04/189 (Washington: International Monetary Fund).
- International Monetary Fund, 2005a, "The Managing Director's Report on the Fund's Medium-Term Strategy" available via the Internet at http://www.imf.org/external/np/omd/2005/eng/091505.pdf
- International Monetary Fund, 2005b, World Economic Outlook, Chapter 3, September.
- International Monetary Fund, 2005c, Global Financial Stability Report, September.
- International Monetary Fund, 2004, "Crisis Prevention and Precautionary Arrangements— Status Report," available via the Internet at http://www.imf.org/external/np/pdr/cp/eng/2004/090304.htm
- International Monetary Fund, 2003, World Economic Outlook, September.
- Jeanne, Olivier, and Romain Rancière, 2006, "The Optimal Level of International Reserves For Emerging Market Countries: Formulas and Applications," forthcoming (Washington: International Monetary Fund).
- Jeanne, Olivier, and Charles Wyplosz, 2003, "The International Lender of Last Resort: How Large Is Large Enough?" in Michael Dooley and Jeffrey Frankel, eds., *Managing Currency Crises in Emerging Markets*, University of Chicago Press, pp. 89–118.
- Johnson, Simon, Jonathan D. Ostry, and Arvind Subramanian, 2006, "Levers for Growth: Policy Lessons from Earlier Bouts of Growth in Developing Countries," *Finance and Development*, Vol. 43, (March), pp. 28–31.
- Kaminsky, Graciela, and Carmen Reinhart, 1999, "The Twin Crises: The Causes of Banking and Balance-of-Payments Problems," *American Economic Review*, Vol. 89, No. 3, pp. 473–500.

- Kaufmann, Daniel, Aart Kraay, and Massimo Mastruzzi, 2003, "Governance Matters III: Governance Indicators for 1996–2002," World Bank Policy Research Working Paper No. 3106 (Washington: World Bank).
- Koren, Miklós, and Silvana Tenreyro, 2004, "Diversification and Development," Working Paper 03-3 (Boston, Massachusetts: Federal Reserve Bank of Boston).
- Krueger, Anne, 2006, "A Response to Allan Meltzer," *Review of International Organizations*, Vol. 1, No. 1, pp. 61–64.
- Kuroda, Haruhiko, and Masahiro Kawai, 2003, "Strengthening Regional Financial Cooperation in East Asia," PRI Discussion Paper No. 03A-10 (Tokyo, Japan: Ministry of Finance).
- Lee, Jaewoo, 2004, "Insurance Value of International Reserves: An Option Pricing Approach," IMF Working Paper 04/175 (Washington: International Monetary Fund).
- Ma, Guonan, and Eli M. Remolona, 2005, "Opening Markets through a Regional Bond Fund: Lessons from ABF2," *BIS Quarterly Review*, June, pp. 81–92 (Bank for International Settlements).
- Maddison, Angus, 2003, *The World Economy—Historical Statistics*, OECD (Paris). Data available at http://dx.doi.org/10.1787/456125276116.
- Manasse, Paolo, and Nouriel Roubini, 2005, "Rules of Thumb' for Sovereign Debt Crises," IMF Working Paper 05/42 (Washington: International Monetary Fund).
- Marshall, Monty G., and Keith Jaggers, 2002, "Polity IV Project, Political Regime Characteristics and Transitions, 1800-2002—Dataset User's Manual," data and manual available at http://www.cidcm.umd.edu/inscr/polity/.
- Meltzer, Allan H., 2005, "New Mandates for the IMF and the World Bank," *Cato Journal*, Vol. 25, No.1, pp. 13–16.
- Mussa, Michael, Paul Masson, Alexander Swoboda, Esteban Jadresic, Paolo Mauro, and Andrew Berg, 2000, *Exchange Rate Regimes in an Increasingly Integrated World Economy*, IMF Occasional Paper No. 193 (Washington: International Monetary Fund).
- Obstfeld, Maurice, and Alan Taylor, 2004, *Global Capital Markets: Integration, Crisis, and Growth* (Cambridge, U.K.: Cambridge University Press).
- Ogaki, Masao, Jonathan D. Ostry, and Carmen Reinhart, 1996, "Saving Behavior in Lowand Middle-Income Developing Countries: A Comparison," *Staff Papers*, International Monetary Fund, Vol. 43, No. 1, pp. 38–71.

- Ostry, Jonathan D., and Jeromin Zettelmeyer, 2005, "Strengthening IMF Crisis Prevention," IMF Working Paper 05/206 (Washington: International Monetary Fund).
- Prasad, Eswar S., and Raghuram G. Rajan, 2005, "Controlled Capital Account Liberalization: A Proposal," IMF Policy Discussion Paper No. 05/07 (Washington: International Monetary Fund).
- Prasad, Eswar S., Kenneth Rogoff, Shang-Jin Wei, and Ayhan Kose, 2003, *Effects on Financial Globalization on Developing Countries: Some Empirical Evidence*, IMF Occasional Paper No. 220 (Washington: International Monetary Fund).
- Rajan, Raghuram, 2006, "The Ebbing Spirit of Internationalism and the International Monetary Fund," Krasnoff Lecture at the Stern School, New York University, March 8, http://www.imf.org/external/np/speeches/2006/030806.htm.
- Reinhart, Carmen, and Kenneth Rogoff, 2004, "The Modern History of Exchange Rate Arrangements: A Reinterpretation," *Quarterly Journal of Economics*, Vol. 119, No. 1, pp. 1–48.
- Reinhart, Carmen, Kenneth Rogoff, and Miguel Savastano, 2003, "Debt Intolerance," NBER Working Paper No. 9908 (Cambridge, Massachusetts: National Bureau of Economic Research).
- Rogoff, Kenneth, 1999, "International Institutions for Reducing Global Financial Instability," *Journal of Economic Perspectives*, Vol. 13, pp. 21–42.
- Rogoff, Kenneth, Aasim M. Husain, Ashoka Mody, Robin J. Brooks, and Nienke Oomes, 2004, *Evolution and Performance of Exchange Rate Regimes*, IMF Occasional Paper No. 229 (Washington: International Monetary Fund).
- Vila, Anne, 2000, "Asset Price Crises and Banking Crises: Some Empirical Evidence," Bank for International Settlements, *BIS Conference Papers*, No. 8 (March 2000).
- Wei, Shang-Jin, 2001, "Domestic Crony Capitalism and International Fickle Capital: Is There a Connection?" *International Finance*, Vol. 4, pp. 15–45.