Enterprise Restructuring in Transition: 
A Quantitative Survey

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Abstract We survey the empirical literature analyzing the process of enterprise restructuring in transition economies. The survey provides new insights into the relative effectiveness of different reform policies, and into how this effectiveness varies across regions. We study the effects of privatization, the importance of different types of owners, the effects of foreign and domestic competition, the consequences of soft budgets, and the role of managerial incentives and managerial human capital, on enterprise restructuring.

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1. Introduction

Over the last decade, more than one hundred and fifty thousand large enterprises in twenty-seven transition countries have encountered revolutionary changes in every aspect of their political and economic environments. Some enterprises have responded to the challenge, entering world markets with great dynamism and becoming indistinguishable from their competitors in mature market economies. Many others remain mired in their past, undergoing protracted deaths, delayed at times by their slippage into a world of barter and subsidies. Thus the revolutionary changes in transition countries have been matched by enormous variance in the degree to which enterprises have restructured their operations and responded successfully to events. With changes in the institutional and policy environment much faster and more encompassing than in virtually any other historical episode, this is as close to a policy laboratory as economics gets.

This mammoth quasi-experiment offers lessons of profound importance for economic studies and for economic policy. Since the pace at which firms restructure is a fundamental determinant of economic growth, analysis of the determinants of restructuring in formerly socialist countries sheds light on the very bases of economic progress. Such analysis addresses age-old questions and poses new ones. What are the relative productivities of state and private enterprises? Does mass privatization work? What is the efficiency cost of diffuse share ownership relative to blockholder ownership? Which private owners are most effective, managers, workers, banks, or investment funds? Does competition promote productivity change? Does it matter whether competitive pressure comes from foreign or domestic firms? To what degree do soft budgets dull enterprise performance? Is a strengthening of managerial
incentives sufficient to inspire turnaround or is replacement of managers necessary for revitalization?

Answers to these questions are obviously of vital significance for economic deliberations in general. But beyond this, the transition process is important in and of itself, because of its geographical scope, the large changes in levels of economic well-being in the last decade, and the ramifications for the world economy and polity. Analysis of enterprise restructuring is central in any effort to gain an understanding of the effects of the most important reform measures adopted in transition countries. With enterprise restructuring apparently more successful in some countries than others, the natural question that arises is whether such differences relate systematically to policy. In this paper, we address this question by examining how the effects of policy have varied between transition countries.

Our objective is to survey the evidence on the determinants of enterprise restructuring in transition. We provide such a synthesis, summarizing the composite conclusions emanating from more than 100 empirical studies. Where possible, we compare the results from the transition literature with those from studies of market economies.

With such a large body of literature under review, it is necessary to pay special attention to the methodology of synthesis. Because there are so many results, verbal description alone would soon result in a hard-to-remember list. An interpretative summary presents its own dangers. Bayesian priors might come to weigh too heavily in the synthesis, a danger that is all too great in the transition arena where the contentiousness of the subject has encouraged forthright

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2 Previous survey papers in this area, e.g., Brada (1996) and Havrylyshyn and McGettigan (2000), used quite limited empirical evidence, which came almost exclusively from Central Europe and China. Now studies of other countries (the former Soviet Union, Mongolia, and Vietnam) are beginning to be numerous, providing a much wider variety of evidence. Nellis (1999) does cover the full range of countries, but we go beyond this by providing a more systematic summary of the evidence and by focusing on a wider set of determinants of enterprise restructuring.
statements. Indeed, we have made such statements, although the reader might be reassured to note that our priors to some extent cancel (Murrell, 1992; Pohl, Anderson, Claessens, and Djankov, 1997).

In view of these factors, we adopt more routinized methods of synthesizing the evidence, drawing on insights from meta-analysis, which has long been in use in other disciplines, particularly bio-medicine, psychology, and education (Hunt, 1997). Apart from making our methods of synthesis transparent, application of meta-analysis has several other advantages. First, it provides tools to aggregate the results of many studies on a similar topic, combining many tests with weak power to produce a single one with larger power. Second, these methods allow one to test hypotheses across groups of studies. For example, we examine whether the replacement of managers is more effective than the addition of incentives and we test whether privatization has stronger results in Eastern Europe than in the former Soviet Union. Third, the synthesis of results can address the thorny issue of differences in the quality of studies, allowing one to gauge the extent to which the conclusions change when one gives greater weight to those studies that are methodologically more sound.

We find that privatization is strongly associated with more enterprise restructuring. Economic effects are quite often very large, for example adding several percentage points to enterprise growth rates. The privatization effect is, however, statistically insignificant in the Commonwealth of Independent States (CIS). These results are robust. They hold when we vary the emphasis assigned to the results of different studies by using weights that reflect the differing attention paid to selection bias or the overall quality of analysis.

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The survey also documents the effects of different types of owners on enterprise restructuring. We find that state ownership within traditional state firms is less effective than all other ownership types, except for worker owners who have a negative effect. Privatization to outsiders is associated with 50% more restructuring than privatization to insiders (managers and workers). Investment funds, foreigners, and other blockholders produce more than ten times as much restructuring as diffuse individual ownership. State ownership within partially-privatized firms is surprisingly effective, producing more restructuring than enterprise insiders and non-blockholder outsiders. The effects of different owners varies between regions. Workers are better owners in Eastern Europe than in the CIS, while banks and concentrated individual ownership are significantly more effective in the CIS than elsewhere.

Product market competition has a significant effect in improving enterprise performance. The economic effects can be large, with a typical study indicating that enterprises in highly competitive sectors are 20-30% more productive than monopolies. The sources of improvement differ between regions, however. In Eastern Europe, the beneficial effect comes mainly through import competition but is also evident through domestic competition. In contrast, domestic competition in the CIS is sometimes statistically insignificant in explaining restructuring, while import competition generally has a negative effect on enterprise restructuring.

We next explore the link between enterprise restructuring and the hardening of budget constraints. The evidence is consistent with the view that hardened budget constraints have had a beneficial effect on enterprise restructuring in Eastern Europe and the CIS. The effect in the CIS is economically larger than that in Eastern Europe.

We also examine whether management turnover – or more broadly, bringing in new human capital – is associated with improved enterprise performance. Statistical analyses show that this
is the case in both Eastern European and CIS countries. We find evidence that the strengthening of managerial incentives leads to a larger amount of restructuring, in economic terms.

Our review of existing research then leads to suggestions on three priority areas for future research. The design of the studies we survey was not driven by attempts to address difficult methodological problems like selection bias or simultaneity, or by efforts to examine the effects of less easily quantifiable aspects of policy, such as the quality of institutional construction, or by considerations that viewed transition in the wider context of development. In the future, the most productive research should focus more directly on these issues.

We conclude by comparing the strength of the effects of the different policy reforms examined in this paper. Privatization to outsiders is associated with the largest restructuring gains, while privatization to workers has no effect in Eastern Europe and is detrimental in the CIS. Hardened budget constraints are the second most important determinant in the CIS, while the establishment of competition is second in Eastern Europe. In contrast, domestic competition in the CIS has no effect and import competition is detrimental.

The paper is organized as follows. Section 2 lays out the nature of the studies under review, in general terms. Section 3 investigates the empirical evidence on whether state-owned or privatized firms undertake more economic restructuring. Section 4 studies the effects of different types of owners. Section 5 links product market competition and enterprise restructuring efforts. Section 6 analyses the role of soft-budget constraints in limiting productivity enhancements. Section 7 documents the role of managers, focusing on management turnover and manager incentives. Section 8 develops the future research agenda. Section 9 concludes.
2. The Nature of Reviewed Studies: Enterprise Restructuring and its Determinants

What is enterprise restructuring and what changes might induce it in transition countries? The perspective taken here is found at the core of every paper that we survey. Enterprises initially functioned in a socialist economy and their behavior was a product of the institutions and policies of that economy. In the 1990s, those institutions and policies changed radically. These changes compelled enterprises to adapt their behavior in order to survive, and perhaps to succeed, in a new liberalized, market environment. The term enterprise restructuring has come to denote the whole process undertaken by enterprises as they adapt their behavior to that necessary for survival and success in a market economy.4

The search for possible determinants of enterprise restructuring therefore lies in those institutions and policies that changed most rapidly in the early years of transition. To identify these, it is useful to reflect on the central characteristics of the socialist economy and its enterprises. These have been widely discussed in the literature and we only need to reiterate a few central issues.5

The classical socialist enterprise was by definition state owned and was oriented to an input-output plan rather than any market. Meeting the plan was of prime importance and the plan was normally very ambitious. Therefore, production issues dominated entrepreneurship, marketing, and cost minimization in managerial concerns. Consistently, the typical manager was a production engineer and not a businessman. Managers faced a mix of monetary and career-based incentives, which were a function of plan fulfillment, enterprise performance, and political loyalty. Profits and efficiency were much less important than under capitalism.

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4 See, for example, Aghion and Schankerman (1999), Frydman et al (2000), and Lizal et al (2001).
5 See Berliner (1976), Murrell (1990), and Kornai (1990) for details.
The enterprise was organized along very hierarchical lines. Workers had virtually no role in enterprise decision-making, except in personnel policy, leading to firing rates that were extremely low by any standard (Granick 1987). The enterprise was not only a producer of goods, but also played an important role in implementing the state's social welfare policies. For these reasons, efficiency considerations were often secondary in determining the size of the workforce.

A labyrinthine bureaucracy replaced the institutions and markets of capitalism. Bureaucratic pressure substituted for competition. The bureaucracy found customers and determined prices, interceding between producer and buyer. It generated contracts and enforced them. Its one-year plans guaranteed short-term working capital and its investment projects automatically received long-term credits. Given the ubiquitous role of the state, much was decided by negotiation. One consequence of the frequency of these negotiations was the universal presence of soft-budgets, which further turned attention away from profits and efficiency.

Pre-transition reforms did change this standard picture in a few countries, notably Yugoslavia (which was centralized only for a few years), Hungary, and Poland (Balcerowicz 1995 and Kornai 1986). Decentralizing reforms reduced the scope of bureaucratic decision-making. Markets and competition increased in importance. Enterprises came closer to ultimate consumers. Paradoxically, however, abandonment of formal planning led to increased bargaining between bureaucracy and enterprise, further softening budgets. Notably also, workers gained more power within enterprises, acquiring experience at being informal owners.

In sum, the pre-transition enterprises were state-owned, protected from competition, shielded from failure by soft-budgets, and run by managers who were production engineers with incentives oriented toward the plan or politics. The enterprises were embedded in a set of
institutions, for contracting, for financing, for governance, that were far different from those of a market economy. Transition polices aimed to change all of this. Therefore, the literature with which we are concerned emphasizes the following determinants of restructuring: ownership, competition, soft-budgets, managerial incentives, managerial characteristics, and broader institutional changes.

The widespread liberalization meant that enterprises had to adapt in order to survive and to prosper in markets that were increasingly contestable, the process of change that the literature conventionally defines as enterprise restructuring. In some studies, the measurement of restructuring focuses directly on enterprise decisions, for example, changes in the structure of corporate governance and management (Estrin and Rosevear, 1999a) or renovations of factories (Djankov, 1999a), or investment rates (Grosfeld and Nivet, 1999). But more usually, the degree of enterprise restructuring has been captured by performance, with performance measured by variables that are objectives of companies in market economies and that were less important for socialist enterprises. Thus, productivity, e.g., Smith, Cin, and Vodopivec (1997) and Lee (1999), or profits, e.g., Claessens and Djankov (1999a) and Estrin and Rosevear (1999a), are often used. But sales or revenue have also been used extensively, e.g., Frydman et al (1999) and Jones (1998), under the premise that the ability to hold onto customers or to find new ones is an indicator of successful change within the enterprise, especially when accomplished in the face of steep recessions (Frydman et al. 1999). There seems to be no consensus in the literature.

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6 There is wide variation in whether levels or growth rates are used. This decision often depends on the availability of data and also reflects whether lagged dependent variables are included as explanatory variables in the equation. The differences between levels and growth specifications diminish greatly with the inclusion of lagged dependent variables.
concerning which variables are the best measures of restructuring, apart from a greater preference for measures of performance than for indexes of internal decisions.\(^7\)

The typical study relates these restructuring measures to their determinants, estimating an equation of the form:

\[
Y = \alpha + X\beta + \gamma P + \varepsilon
\]  

where the enterprise is the unit of observation, \(Y\) is the restructuring measure, \(P\) captures some aspect of the reforms to which the enterprise is subject, e.g., ownership change, degree of hardness of the budget, etc., \(X\) is a vector of other enterprise characteristics, and \(\varepsilon\) is an error term. \(\gamma\) is the parameter of direct interest. The overwhelming majority of papers justify their exact choice for (1) pragmatically, rather than presenting a structural derivation.

The studies we examine use data from medium-large and large enterprises. These enterprises were the core of the socialist economy and when liberalization came they remained going concerns, leading to some continuity in operations and personnel. This continuity facilitated data collection. In contrast, smaller enterprises were notoriously weak under socialism and soon were swamped by new entrants. They often vanished, with their assets resurfacing in new activities, with new personnel. Data collection for smaller enterprises, therefore, faced enormous difficulties, leading to few studies examining the progress of the small enterprises established before transition.

The paragraphs above emphasize the common elements of the studies under review. We now turn to important ways in which studies differ. The cataloging of these differences and the determination of their effect on results are important features of our survey. We focus on three

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\(^7\) The lack of consensus probably results from the difficulties of obtaining data, with researchers using the best measure available.
such variations in the characteristics of studies: measurement of Y, selection bias, and overall quality.

Many varieties of Y appear in the studies, but one distinction, already suggested above, is worth emphasizing. One category of Y comprises quantitative indicators of enterprise performance, which are based on accounting information. Other Y’s are somewhat softer, perhaps derived from survey questions on economic performance posed to managers, e.g., forecasts of sales in the surveyed year as in Earle (1998), or using information collected about reorganization, e.g., the introduction of new products as in Carlin et al (2001), or reflecting operational factors only indirectly related to current performance, e.g., the extent of wage arrears as in Lehmann, Wadsworth, and Acquisti (1999). We will refer to these two types of indicators as quantitative and qualitative.\(^8\)

The prevailing sentiment in the literature is that the quantitative variables are to be trusted more (even with the mis-reporting and accounting difficulties that are rife in transition countries). They measure directly the prime output of enterprise restructuring, economic performance. On the other hand, there is also the view that quantitative performance might suffer when an enterprise is investing in large-scale reorganization and that the results of this process might be observed earliest in qualitative variables. We focus primarily on the quantitative indicators in this paper, deeming them more reliable. However, where a sufficient number of studies is available, we examine both types.

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\(^8\) We do not use indicators for which there is substantial disagreement in the literature on whether the sign of \(\gamma\) should be positive or negative. The most pertinent example is employment, whose direction of change would depend very much on the extent of excess labor under the old regime.
A second crucial variation between papers lies in the degree of attention paid to possible biases in the estimates of $\gamma$ due either to selection effects or simultaneous causation. Typical cases of selection bias occur when either the level of ownership or the use of managerial incentives is systematically related to some unobserved enterprise characteristic that also affects $Y$. Examples of simultaneous causation are when an enterprise's market share is being used to measure competition or subsidies are being used to measure soft-budgets: in each case, the measured determinant of restructuring reflects enterprise performance. These problems have been thoroughly recognized in the literature, but solutions are not always easy to obtain. Thus, for example, in the studies examining private versus state ownership in Section 3, only 53% of the estimates of $\gamma$ employ methods that might serve to counter selection bias.

The prevailing evidence suggests biases due to selection effects or simultaneous causation are a real possibility. For example, van Wijnbergen and Marcinin (1997) show that selection into Czechoslovakia's voucher program was non-random and that it must be taken into account in ascertaining the effects of the voucher program on outcomes. Moreover, when there are OLS estimates and estimates employing some technique to counter bias in the same paper, they quite often differ considerably, suggesting the presence of bias. (See, for example, Brown and Earle (2000), Glennerster (2000), Anderson et al. (2000b), and Earle (1998).)

The fact that some studies have identified non-trivial selection or simultaneity bias suggests that we must be sensitive to its presence. Hence, in every section of this paper, we present conclusions that allow the reader to understand how the synthesis of results might have been affected by these biases. We present sufficient information to allow each reader to judge which of the broad conclusions emanating from this literature fall under the shadow of selection bias.

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9 Our use of the term selection bias might not be wholly consistent with the precise terminology of econometrics. We simply follow the literature.
How we do this is best explained in a practical context, in the next section. But it must be emphasized that we have directly confronted issues of selection or simultaneity biases in reaching our conclusions, that we draw back from stating strong conclusions where we feel the possibility of such bias leaves some residual doubt, and that nevertheless there are many strong conclusions that we can reach.

A third variation between papers on which we focus is quality of analysis. One of the primary objections to the application of meta-analysis hinges on the fact that the quality of empirical work varies greatly across papers, meaning that a simple aggregation of results might give undue weight to lesser quality research. Therefore, some scholars prefer to focus reviews of empirical literature on the high points, ignoring papers that are less convincing from a methodological standpoint. However, it is also possible to take a middle road, one that examines whether the composite results change when considerations of quality are taken into account. This is our approach. How we do this is, again, best left until our methods can be explained in context in the next section.10

10 An earlier version of this paper (Djankov and Murrell, 2000) examined other variations in the methodological characteristics of studies. It applied the methods that appear below (on quality and selection bias) also to the length of time (for the pertinent reform) that is embodied in the estimates and the number and appropriateness of the variables used in X. In the present paper, these dimensions of quality are simply absorbed into the overall measure of quality. The reader can refer to that earlier paper for the more detailed results. The data compiled for that study, except for our assessments of the overall quality of papers, are available from the authors on request.
3. State Versus Private Ownership

In early transition debates, there was agreement on the goal of an economy dominated by private ownership, but conflicting views on how best to attain this, through fast privatization (Sachs 1992, Boycko, Shleifer, and Vishny 1995) or through stimulation of a nascent private sector (Kornai 1990, Murrell 1992, 1995). The relative emphasis on the differing strategies waxed and waned with events. With deep crisis in Eastern Europe in the early 1990's, fast privatization gained emphasis. However, after the recovery of Poland, a relatively slow privatizer, that emphasis declined (Pinto et al. 1993, Aghion, Blanchard, and Burgess 1994, and Brada 1996). But Poland is only one of many transition countries, an outlier at that. Now there are fast privatizers performing well (Estonia) and fast privatizers performing badly (Russia), with similar variation across slow privatizers (Poland versus Romania), giving sustenance for a variety of opinions about the results of privatization (Pohl et al. 1997, Havrylyshyn and McGettigan 2000, Stiglitz 1999, Black et al. 2000). To referee this debate, it is necessary to turn to the microeconomic empirical literature.¹¹

Studies examining whether privatized enterprises perform better than state owned enterprises use equation (1), with P a measure of the degree of private ownership of an enterprise of pre-1989 vintage. A large variety of variables takes the place of Y, X, or P with no consensus on the nature of the equation to be estimated. For Y, a significant number of papers use measures of output levels, captured for example, by sales, e.g., Konings (1997) and Earle (1998), or value added, e.g., Anderson et al (2000a) and Smith et al (1997). Other papers use growth rates of the same variables, e.g., Frydman et al (1999) and Jones (1998). Qualitative versions of

¹¹ Megginson and Netter (2001) undertake an extensive survey of the effects of privatization, world-wide. Their results are primarily germane to countries with long-established market economies.
Y are also extensively used especially in studies of the former Soviet Union, where there are greater difficulties in obtaining accurate accounting data.

One common form of \( P \) is the percentage of shares owned privately, e.g., Brown and Earle (2000). Other papers use a dummy variable capturing whether private ownership is above some threshold value, for example 0% in Estrin and Rosevear (1999a) and 50% in Jones and Mygind (1999). Frydman et al (1999) and Claessens and Djankov (2002) form their dummy variables on the basis of corporate laws, the former defining a privatized enterprise as one in which private ownership is above the 33.3% threshold needed to block strategic company decisions while the latter also uses the 66.7% level that guarantees that a state minority owner cannot veto such decisions.

Variety is also present in the \( X \)'s. Sectoral, regional, and (in the case of panels) time and firm dummies are common. Among the \( X \)'s used in various studies are measures of competition, levels of soft-budgets, size of firms, access to finance, year of privatization, and many more. Pre-privatization levels of dependent variables are sometimes included under the premise that these might dampen the effects of selection bias. One common formulation includes capital and labor in the \( X \)'s and uses output for \( Y \), with the basic equation then representing a production function and the estimate of \( \gamma \) capturing the effect of ownership on total factor productivity.

The variety in the formulation of estimating equations is a reflection of two factors. First, there is the absence of a single compelling theory that models the process of change within an enterprise.\(^{12}\) Without such theory, specifications for estimating equations rely on ad hoc formulations. Second, the set of variables for which data are available varies greatly, with every study having deficiencies in some respect. Given these reasons for the variety of approaches,

\(^{12}\) Additionally, there is also no agreed theory on how to model the selection of firms for privatization.
with none obviously superior to all others, it seems judicious to include a wide range of studies in drawing general conclusions.

The similarities and differences between two papers (Frydman et al, 1999, and Anderson et al 2000b) exhibit the methodological decisions to be made when conducting such studies and the variations in results that can be obtained. Frydman et al. examine the performance from 1990 to 1993 of a panel of 218 privatized and state firms from the Czech Republic, Poland, and Hungary, while Anderson et al. focus on 1995 data for 211 privatized (including partially state owned) Mongolian enterprises. Data collection, including sample design, was carried out specifically for each of these studies, raising the quality, extensiveness, and appropriateness of the information collected but resulting in small sample sizes. Each study examines the effects of privatization as a whole and the effects of different owners. We discuss the latter in the next section.

Both studies wrestle with the choice of the dependent variable, how to measure ownership, which X's to include, and how to counter selection bias. Their decisions differ a great deal. Frydman et al. use four different dependent variables, rates of growth of revenues, employment, revenues per employee, and costs per unit of revenue. Their ownership variable is a dummy. As controls, they use initial levels (not growth rates) of the four performance measures, accompanied by sectoral, country, and time dummies. Selection bias is parried in a number of ways, primarily by methods developed for the analysis of treatment effects in panels. In separate analyses, the authors use a dummy variable (in X) capturing pre-privatization differences between state firms and privatized firms, they employ a firm fixed-effects model, and they verify that performance of those firms slated for privatization, but not yet privatized, is closer to that of

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13 A major aspect of Frydman et al. (1999) is the effect of privatization on different dependent variables. For reasons of space, we cannot examine this interesting issue here.
state firms than privatized ones. The cumulative effect of these analyses is to convince the reader that the privatization effects are real, rather than an artifact of selection for privatization.

Enterprise record-keeping during Mongolia’s early transition was so poor that Anderson et al (2000b) could not obtain panel data. Hence, they focus on performance in one year, using three different dependent variables, total factor productivity (within a Cobb-Douglas production function), sales per employee, and value-added per employee. The equations for the latter two variables include a lagged dependent variable, thus nesting a specification in which growth is the dependent variable. Since the estimated coefficients on the lagged dependent variables are significantly different from one, this suggests that growth measures are not suitable dependent variables. The ownership variable is the percentage of enterprise shares held by non-state owners. Controls include regional and sectoral dummies, levels of competition, and the presence of soft-budgets. Selection bias is countered through the use of instrumental variables. Suitable instruments were available because of idiosyncratic features of the privatization program and due to the varying incentives of different types of owners during privatization. Comparison of OLS and instrumental variables results suggests that OLS estimates of the effect of privatization are upwardly biased.

Frydman et al. and Anderson et al. obtain strikingly different results. In Central Europe, privatization improves revenue growth by approximately 7% a year; in Mongolia, wholly private firms are 30% to 70% less efficient than completely state-owned firms. Although there are many differences between the analyses of these two papers, it is quite unlikely that methodological differences can explain the divergence in results, since both papers use conventional methods to solve the usual problems and pay close attention to possible biases. An obvious candidate to explain the differences in results is the countries studied, the most advanced transition countries
versus one of the most backward. We examine this issue later in this section. Another possibility is the types of owners generated during privatization, which is the subject of Section 4.

One respect in which the two papers are similar is in their use of quantitative dependent variables derived from accounting information. In this respect, Carlin et al. (2001) provide an interesting contrast. They use data from a survey of over 3,000 firms in 25 countries. Because of the logistical and compatibility issues involved in collecting accounting data from such a wide variety of countries, they rely for their dependent variables on responses to questionnaires. One set of questions focused on changes in real sales and employment, leading to a measure of productivity growth. Another set focused on internal restructuring, asking about upgrading of existing products, introduction of new products, opening of new plants, and quality accreditation. Using principal components to combine the answers on this latter set, the paper derives a measure of new product restructuring.

Carlin et al. do not find a direct effect of change in ownership on productivity or sales growth, but they do find a significant effect of privatization on new product restructuring. Moreover, new product restructuring directly increases sales and productivity growth, implying an indirect effect of ownership on enterprise growth. These results give some sustenance to the argument that qualitative variables provide useful information, where accounting ones are not available. The authors, nevertheless, caution the reader that they were not able to implement procedures to counter selection bias on the ownership variable.

The three papers discussed above generate highly varying results, which is a characteristic of the literature as a whole. In Table 1, we focus on the economic size of effects. Such information is usually not emphasized in the papers under review, nor in, for example, the Megginson and Netter (2001) survey of world-wide privatization. Indeed, it is remarkable that in
most cases we had to calculate the numbers in Table 1 ourselves, sometimes using a considerable degree of interpretation. Moreover, a significant number of papers did not offer enough information for analogous estimates to be calculated. This suggests that the surveyed papers do not emphasize the economic interpretation of their estimates sufficiently.

The estimates in Table 1 are sampled to reflect a variety of contexts and results. The first conclusion from that table is that privatization has economically significant effects. A second conclusion is that these effects are far from uniform. Privatization done in the right way, or under the right circumstances, can have huge positive effects, but privatization can also be hugely detrimental.

This large variation in results suggests that an overall judgment on the effects of privatization can only be reached by employing methods that aggregate the results of the many papers under consideration. Moreover, to understand the reasons for variations between estimates, the aggregation methods should offer the possibility of assessing how methodological factors influence estimates and should allow for comparisons between sets of studies. It is to this aggregate analysis that we now turn.

3(a) Statistical significance: combining t-statistics

We are interested in the size and statistical significance of the estimate of $\gamma (\hat{\gamma})$ in equation (1). The $\hat{\gamma}$'s of different studies are not directly comparable because Y and P are measured in many different ways. Therefore, we seek methods of combining the results of studies with different characteristics. We first begin by combining t-statistics.

In this section, we combine the results of 37 distinct studies. Table 2 lists these studies, the countries included in the studies, their Y’s, and their P’s. Within these studies, we have
identified 93 distinct empirical analyses and extracted 93 $\hat{\gamma}$'s together with their corresponding t-statistics. We use more than one analysis from a single paper only in cases in which the estimates are derived from conceptually distinct analyses, e.g., from completely different forms of the dependent variable or from different countries.

[Table 2 here]

The theory justifying the aggregation of t-statistics is analogous to that used when conducting tests on the mean of a sample. Collect several independent observations from the same distribution, find their mean, and deduce the distribution of the mean. The variance of the sample mean will be smaller than that of individual observations, implying that statistical tests based on the mean will be more powerful than tests on individual observations.

The data comprise $M$ t-statistics on $\hat{\gamma}$'s, $t_1,\ldots,t_M$. The following is normally distributed:\[^{14}\]

$$\sum_{k=1}^{M} t_k / \sqrt{M}$$

(2)

$M$, which is the number of analyses, plays the role of sample size. It is readily apparent that a set of analyses with small positive t-statistics could be significant in the aggregate even with non-significance in each individual analysis. As it happens, less than one-half of the t-statistics examined in this section are statistically significant, but collectively they are highly significant.

Our synthesis of results relies on tests of (2), whereas the most common method of combining results in literature reviews is the method of vote-counting (Hunter and Schmidt, 1990). Vote-counting concludes that there is non-significance in the aggregate when a set of studies has a median t-statistic that is insignificant. This method produces misleading

[^{14}]: Assuming sample sizes in all analyses are sufficiently large, which is the case here.
conclusions, since it combines probability information erroneously, a point that is best illustrated with a simple example.

Researcher A obtains a t-statistic of 2 in a study, pronouncing significance for the effect. Researcher B, not favorable to A’s conclusions, conducts two separate studies of two separate countries and obtains t-statistics of 1 in each study. Researcher B triumphantly announces that A has been mistaken, for the vote is now 2 studies to 1 for non-significance. But the combined statistic obtained by applying (2) to all three studies is $\frac{4}{\sqrt{3}} = 2.31$. B has actually strengthened support for A’s conclusions.

Column (1) of Table 3 contains the results obtained by applying equation (2). The rows reflect two different ways of grouping estimates. First, there is the quantitative-qualitative division of dependent variables, discussed above. Second, there are regional groupings. Corresponding to much of the rest of the literature (e.g. EBRD 1999) the basic split is between the non-Baltic former Soviet Union (the CIS) and the rest. The countries outside the CIS comprise Eastern Europe and the Baltics (with one study of China). For brevity, but at the cost of some inaccuracy, we will refer to the two groups as Eastern Europe (EE) and the CIS in the rest of the paper. Interestingly, once we seek a criterion that corresponds to our split of countries, we find that it is the length of time that the countries labored under communism, seventy years for each CIS country and less than fifty years in EE. The reader therefore might like to think of our regional groups as "two generations" and "three generations", indicating the length of time under communism.

[Table 3 here]

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15 In the set of papers under consideration, there are two studies of Mongolia. Since this country looks like a typical member of the CIS (Korsun and Murrell, 1995), Mongolia is included in the CIS grouping.  
16 Moldova is an exception to this rule. This country contributes only a small amount of data to this paper.
The significant effects of privatization show clearly in all but one of the statistics appearing in column (1). Thus, the first conclusion from this table is that the aggregate effects of privatization are positive. This also applies when both quantitative and qualitative indicators are examined separately. The one case where the effects of privatization are not significantly positive is for quantitative indicators for the CIS.

How robust are these conclusions? The papers that contribute analyses to our data vary a great deal, in the quality of analysis, in general, and the amount of attention paid to selection bias, in particular. Therefore, due caution suggests that we examine whether the above conclusions could reflect methodological deficiencies in some of the surveyed papers, rather than real economic phenomena.

A straightforward way to undertake such an examination is to weight the various t-statistics, using weights reflecting methodological differences. Suppose that there are weights, \( w_1, \ldots, w_M \), for each t-statistic. Then the following statistic has a normal distribution:

\[
\sum_{k=1}^{M} w_k t_k \sqrt{\sum_{k=1}^{M} w_k^2}
\]

This weighting procedure discounts studies with smaller weights. For example, if there are particular concerns about selection bias, the weights would reflect attention paid to this issue.

We have constructed two sets of weights. First, we rated papers on a scale of 1 to 3, reflecting the amount of attention paid to the problem of selection bias. A score of 1 indicates no attempt at countering such bias, as in Djankov (1999a), while 2 suggests a less than complete attempt, for example, using fixed effects without any strong justification that this approach addresses the problem of bias (Grigorian, 2000). A 3 involves a convincing attack on the problem, as in Brown and Earle (2000), which uses both fixed effects and instrumental variables. Obviously the choice of scale is ad hoc, but it does fulfill our basic purpose, which is to check
whether conclusions change noticeably when discounting results derived from weaker methodologies. This weighting plays a role analogous to the procedure of de-emphasizing some papers in the standard literature review. But it approaches the issue in a somewhat more transparent manner, since the reader can directly observe the consequences of the de-emphasis.

We also constructed a rating of the overall quality of the papers. This rating reflects systematic information collected on specific issues such as selection bias, number of reform years reflected in the data, the nature of Y, and appropriateness of X's, as well as our own subjective assessment of the strength of the analysis.\textsuperscript{17} It also reflects the relative standing of the journal in which the paper is published, if it has been published. The rating is on a scale of one to ten. Again, the use of this rating is to examine whether conclusions change noticeably if the results from weaker methodologies are discounted.

Comparisons across the columns of Table 3 suggest robustness in the conclusions for qualitative variables in both regions and for quantitative variables in EE. For example, the evidence in Table 3 suggests quite clearly that the overall conclusions for EE are not vitiated by the possibility of selection bias. Table 3 serves to blunt the perception held by some that selection bias presents an insurmountable problem in assessing the effects of privatization.

There is one case where weighting by quality does change the aggregate result: the statistic for quantitative variables in the CIS changes from non-significance to significantly negative. Given this sensitivity to the emphasis placed on different results and given the differences in the results for qualitative and quantitative measures for the CIS, it is difficult to draw an overall conclusion on the effects of privatization in this region. If the results for the quantitative

\textsuperscript{17} An earlier version of this paper presented results for many sets of weights, reflecting each methodological variable on which we collected systematic information. The reader can examine these results in Djankov and Murrell (2000).
variables are deemed most reliable, then our analysis suggests that privatization has not had positive effects.

3(b) **Strength of effect: comparisons across regions**

Although it is tempting to do so, one cannot immediately conclude from Table 3 that the effect of privatization on the quantitative variables in EE is greater than the effect in the CIS. Table 3 provides information only on the statistical significance of an effect relative to 0. It is quite possible that an effect can be weaker in statistical terms but stronger in economic terms. To compare the size of the two economic effects, it is first necessary to identify a statistic that summarizes aggregate effect size for a heterogeneous set of studies. In order to focus on substantive results, the more formal discussion of that statistic is relegated to an Appendix. We concentrate on intuition below.

The t-statistic is not suitable because its magnitude reflects sample size, which has nothing to do with the economic effect of privatization. $\hat{\gamma}$ is not suitable because it is dependent on the units of measurement of Y and P, which vary greatly between studies. On the positive side, the t-statistic is invariant to units of measurement, while $\hat{\gamma}$ does not depend on sample size. Thus, we seek a measure that combines the positive properties of the t-statistic and of the estimated parameter, while eliminating their negative characteristics.

The standard procedure in meta-analysis is to use the partial correlation coefficient (Rosenthal, 1984). Partial correlation coefficients are not usually published, but they are easily calculated from regression statistics that appear in all papers.\(^{18}\) Since correlation coefficients are

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\(^{18}\) Greene (2000, pp. 233-6) proves this result within the classical regression framework, to which a majority of the studies reviewed conform. When applying this result outside this framework, we simply appeal to analogy. This suggests that more effort should be made in including information in published papers that allows the estimates to be more readily compared to estimates in other papers that examine the same economic phenomena.
unit-free, they are comparable across a heterogeneous set of studies and therefore can be aggregated to form a summary statistic on effect size for the whole set of studies.

The first two rows of column (1) of Table 4 show the simple unweighted means of the estimates of the partial correlations derived from two groups of studies, those on EE and those on the CIS. As expected, the EE estimate is larger. As the Appendix shows, it is straightforward to construct a normally distributed test statistic that reflects the null hypothesis that these two means are equal. This test statistic appears in the third row of Table 4, providing evidence that the privatization effect is significantly larger in EE than in the CIS.

[Table 4 here]

One disadvantage of working with partial correlation coefficients is that their size is not obviously interpretable in terms of real economic phenomena. However, a few facts might make the numbers in Table 4 more easily interpretable. For example, if a study had the same sample size and standard errors as the Frydman et al result in Table 1 (second row, first column), then a partial correlation coefficient of 0.05 would correspond to a percentage growth of sales of privatized enterprises that is 3.51 higher than that of state enterprises. Using the Brown and Earle (2000) result (Table 1 first row, last column) in a similar fashion, a partial correlation coefficient of -0.05 would correspond to privatized enterprises being 38% less efficient than state enterprises.

Weighted means of the partial correlation coefficients can also be calculated and a normally distributed test statistic can be derived to examine the significance of the difference between the two weighted means. Columns (2) and (3) of Table 4 present the results for the aggregate partial correlation coefficients calculated using the weights that were described in the context of Table
3. Thus, differences between the columns of the table reflect the sensitivity of the overall results to varying judgments on the importance of methodological quality.

When examining the test statistics for qualitative and quantitative variables together or when the quantitative variables are examined alone, the test statistics affirm (at the 1% significance level) that the privatization effect is stronger in EE than in the CIS. For the quantitative variables, the use of the weights adjusting for methodological quality actually strengthens this conclusion, suggesting that selection bias, or other methodological deficiencies, do not play any role in leading us to this conclusion. The results are similar, but weaker statistically, for the qualitative variables, perhaps because there are so few studies for EE that fit into this category. In sum, there is strong evidence that the effect of privatization in Eastern Europe has been much greater in magnitude than in the CIS.

4. **The Effects of Different Types of Owners**

One reason that changes of ownership might have had varying effects across regions is that different privatization processes led to different mixes of owners. In the absence of quick re-trading of shares (Anderson, Korsun, and Murrell 1999 and Blasi and Shleifer 1996), the owners created by the privatization process have had more than a temporary effect on enterprise behavior. This is important, of course, only if ownership makes a difference in restructuring. As it happens, transition experience offers unusually good evidence on this score.

The pre-transition literature offers a variety of disparate empirical results. There has been general support for Berle and Means' (1933) contention that diffuse ownership yields power to managers with less interest than shareholders in restructuring (Johnson et al.1985; Roll, 1986). Morck, Shleifer, and Vishny (1988) found that some managerial ownership can ameliorate such problems, while Shleifer and Vishny (1986) argue that blockholders have an incentive to monitor
management. However, blockholders also have opportunities to expropriate value from minority shareholders. Quite separately, the comparative systems literature pursued the question of whether the pathologies predicted by the neoclassical model of the labor-managed firm outweigh the motivational effects of worker ownership. The evidence is mixed (Blinder, 1990; Bonin, Jones, and Putterman, 1993; Kruse and Blasi, 1995).

The existing literature on market economies does not provide a clear picture of which type of owner is most advantageous for restructuring. Coase (1988) and Demsetz and Lehn (1985) suggest a reason for the lack of clarity. They argue that the evidence from mature market economies might be spurious. If the transaction costs of taking value-maximizing positions in firms are low, each firm would have the "right" ownership structure: there might not be a relationship between ownership type and restructuring.

Therefore, evidence from transition countries has a vital contribution to make. In transition economies, ownership was largely determined through political and administrative processes rather than endogenously in markets with low transactions costs. In many cases, ownership structure is exogenous. In others, it is relatively easy to obtain reliable instruments to counter endogeneity bias. The evidence from transition should offer much better information on the effects of different owners than has been generated previously.19

The results for transition countries are unique in another respect. Many different types of owners were created. At the time of privatization, government agencies and firms knew the structure of ownership and could impart this information to researchers. The resultant ownership information was at a level of detail that could not be obtained in mature market economies. Hence, there is a large set of studies examining the effects of different owners. By aggregating

19 For example, Megginson and Netter's (2001) comprehensive survey of the effects of privatization in all types of economies does not reflect on the relative effectiveness of different types of private owners.
the results, we are able to compare the effects of a comprehensive set of owners, something not previously accomplished in the literature.

We begin by examining the characteristics of the pertinent papers. The methodologies used by the papers are essentially the same as those discussed in section 3. In fact, many papers begin with an analysis of state versus private and then turn to a disaggregation of private ownership, e.g., Brown and Earle (2000), Earle (1998), Frydman et al. (1999), and Jones (1998). Such papers use the same methodology and independent variables in both parts of their analyses, simply making $P$ in (1) a vector that captures the ownership held by different entities.

A further focus on Frydman et al (1999) and Anderson et al (2000b) exhibits the methodological decisions to be made when choosing the elements of $P$ and the variations in results that can be obtained. Frydman et al. examine outsiders, insiders, and the state in one analysis, and foreigners, domestic financial firms, domestic non-financial firms, domestic individuals, the state (in a privatized firm), the state (in a non-privatized firm), managers, and workers in another analysis. This is an unusually comprehensive list of owners to appear in one paper, and most papers use a much smaller set, e.g., Smith et al (1997) using foreigners, insiders, and the state and Claessens and Djankov (1999a) managers and outsiders. The ownership variables in Frydman et al. are dummies capturing whether the given owner is the largest shareholder, a common approach, e.g., Jones and Mygind (1999, 2000). Measurement of ownership in this way reflects a somewhat unusual feature of the Frydman et al. data, the highly concentrated ownership in all privatized firms.

In Mongolia, examined by Anderson et al. (2000b), the variety of owners after privatization is narrower and the degree of ownership concentration less. Managerial and worker ownership are highly correlated due to the nature of the privatization scheme and there is no value in
differentiating between them. Individuals with small stakes are dominant among outsider owners. Hence, analysis of the effects of different owners in Anderson et al. only contrasts the state (in a privatized firm) versus outsiders versus insiders. In contrast to Frydman et al.’s dummy variables, ownership is measured by the percentage of shares held by each type of owner, perhaps the most usual approach, e.g., Brown and Earle (2000), Claessens and Djankov (1999a, 1999b), Earle and Estrin (1997), and Smith, Cin, and Vodopivec (1997).

Frydman et al. find that foreign and domestic financial owners produce the largest positive effects, while outsider owners outperform insiders, results echoed later in our synthesis of many papers. Their results are mixed when comparing insider ownership to state ownership in enterprises with 100% state ownership. Anderson et al. find that outsiders and insiders perform less effectively than the state in privatized enterprises, while there is no significant difference between insiders and outsiders.

What explains the differences in these two sets of results? Selection bias or omitted variables seem unlikely candidates, given the attention paid by both studies to these issues. Rather, the outsider owners are very different in Central Europe, where they are blockholders, than in Central Asia, where they are individuals, usually with tiny amounts of ownership. Anderson et al. examine whether diffusion of ownership can explain their results and do find better performance in those few enterprises in which blockholders have obtained a seat on the board of directors.20 The positive relation between ownership concentration and performance is a direct focus of Claessens and Djankov’s (1999b) study on the Czech Republic.

In reconciling the findings of Frydman et al. and Anderson et al., the results on state ownership repay particularly close examination. Anderson et al. were able to sample only privatized enterprises (including ones with large state ownership). Thus their study includes no
firms that remained under traditional state ownership. Frydman et al. sampled both privatized and non-privatized firms, thus having two state ownership variables. The Anderson et al. results on state ownership are comparable only to those of Frydman et al. on state ownership in privatized firms. When this is understood, the two studies' results appear much more consistent, since Frydman et al. find that state ownership in a privatized firm performs at least as well as the median type of private owner.\textsuperscript{21} However, the two studies provide very different interpretations of their results. Frydman et al. view the state as passive, with private owners dominating the decisions of partially state-owned privatized firms. Anderson et al. view the Mongolian state as active and enormously pressured by economic necessity. The government was more willing than insiders to push for efficiency and more able to do so than outsiders.

In providing a reconciliation of the results of the two studies, the above paragraphs provide an important warning to the harried reader trying to absorb a large number of results very quickly. Details matter crucially, for example which study used the privatization agency to obtain its sample or which study's data reflect concentrated ownership. Choice of estimation method can even influence the interpretation of which owners are reflected in results, fixed effects estimates reflecting only ownership that changes over the sample period. These facts are often not emphasized in papers.

4(a). Quantifying the Differences Between Owners

We now turn to the quantitative synthesis of results. The objective of this synthesis is to find the relative sizes of the effects of different owners and to test which owners have significantly different effects from others. We follow the literature in identifying the ownership categories

\textsuperscript{20} However, because of lack of instruments, they are not able to control for selection bias on this variable.

\textsuperscript{21} As is clearly shown when we aggregate results below, this result is echoed in many other studies.
that we analyze, identifying those ownership types that recur consistently in a number of studies.\textsuperscript{22} This resulted in eleven categories, some of which overlap:\textsuperscript{23}

1) traditional state ownership: enterprises that are 100\% state-owned and that have not been part of a privatization program;

2) the state in commercialized (or corporatized) enterprises: state ownership in enterprises that have been legally separated from the state bureaucracy, that are treated as private under the corporate governance laws and that have, usually, been part of a privatization program;\textsuperscript{24}

3) enterprise insiders: a composite group, including both workers and managers;

4) outsiders: a composite group consisting of all non-employee, non-state owners;

5) workers (non-managerial employees);

6) managers (managerial employees);

7) foreign owners of all types;

8) banks, except those included in 7;

9) investment funds, except if ownership of the fund is such that 2, 7, or 8 applies;

\textsuperscript{22} Since there is no source that provides a definition of a standard set of ownership categories, there are inevitable variations across the empirical papers in how different owners are defined. Where papers used ownership types that differed too much from the types that appeared in other papers, we did not use the results. This happened in only a small number of cases.

\textsuperscript{23} For example, workers and managers together are insiders. One should not assume that an aggregate category necessarily produces the same result as the sum of its parts. For example, estimates of the effects of managers and workers usually appear in different studies than those for insiders as a whole. Which owners are included in a study is not, however, random. Researchers are more likely to collect data on a specific owner when the privatization process gives scope for that owner to be active in privatization procedures. Hence, the results for insiders probably reflect somewhat different circumstances than those for managers and workers on their own. We should not expect to see the insider effect simply equal to the weighted sum of the worker and managerial effect.

\textsuperscript{24} In most countries commercialization (or corporatization) occurred as preparation for privatization. Therefore, our data on this ownership type is dominated by results for enterprises that have less than 100\% state ownership. Where a study did not provide enough information for us to know which of the two categories of state ownership applied or where the study mixed the two types, we assigned the results to the traditional state ownership category.
10) blockholders: outsider ownership concentrated in the hands of large individual owners, except where the blockholder could be classified in 2, 6, 7, 8, or 9;

11) diffuse outsider: the residual outsider ownership category, when outsider owners are not identified as belonging to 7, 8, 9, or 10, a category dominated by individual outsider owners each of whom owns a miniscule portion of any specific enterprise.25

All papers that we review examine a subset of these 11 types of owners. For example, a paper might focus on the state versus insiders and outsiders and estimate:

\[ Y = \alpha + X\beta + \delta O + \theta I + \varepsilon \]  

(4)

\( O \) and \( I \) are measures of the amount of ownership held by outsiders and insiders, state ownership is the omitted variable, \( \delta \) and \( \theta \) are the parameters of interest, and all other variables are as defined before. The information of prime interest is the comparison of \( \delta \) to \( \theta \) (outsiders versus insiders) and each of these to 0 (insiders or outsiders versus the state). We examine both statistical significance and the magnitude of the ownership effect.

The methods used here are extensions of those already introduced in section 3. However, a number of complications arise in developing the results. First, important information is often missing from papers (relevant to the statistical precision of the comparison between \( \delta \) and \( \theta \)). Therefore, it is necessary to investigate how to fill this gap. Second, there is no longer a binary comparison between state and private, but a multilateral comparison between many types of owners. Therefore, a dummy-variable regression framework is required to combine results, rather than simply using differences between means. Third, to take advantage of information on the precision of estimates from different papers, it is necessary to use generalized least squares. Fourth, the weighting of results according to methodological quality also requires generalized

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25 This category is used only when the study differentiates between various types of outsiders. When all outsiders are treated as one, owner group 4 applies.
least squares. A full consideration of these complications entails an extended discussion of methodology, in which the average reader is probably not interested. The discussion is therefore relegated to an appendix.

From 24 studies on 20 countries, we have compiled all usable information on the effects of different types of owners on quantitative enterprise outcomes. The pertinent papers, together with the countries and owners in each study, are as follows: Anderson, Lee, and Murrell (2000b, Mongolia, owners 2, 3, and 4 from the above list), Brown and Earle (1999, Russia, owners 2, 3, 4, 7, and 11), Claessens and Djankov (1999a, Czech Republic, 4 and 6; 1999b, Czech Republic, 2 and 7-10), Claessens, Djankov, and Pohl (1997, Czech Republic, 2 and 7-9), Cull, Matesova, and Shirley (2000, Czech Republic, 1 and 7-9), Djankov (1999b, Georgia and Moldova, 1, 6, and 11; 1999c, 6 CIS states, 2, 5-7, 10, and 11), Earle (1998, Russia, 1, 4-11), Earle and Estrin (1997, Russia, 1, 4-11), Earle and Telgedy (2001, Romania, 2, 3, 10, and 11), Estrin and Rosevear (1999a, Ukraine, 1-6), Frydman et al (1999, Central Europe, 1-10), Grosfeld and Nivet (1999, Poland, 1 and 2), Jones (1998, Russia, 1, 4-6, and 8), Jones, Klinedinst, and Rock (1998, Bulgaria, 1 and 2), Jones and Mygind (1999, Baltics, 1, 5-7, and 10; 2000, Estonia, 2, 5-7, and 10), Konings (1997, Slovenia, Hungary, and Romania, 1 and 5), Lee (1999, China 1 and 2), Lehmann, Wadsworth, and Acquisti (1999, Russia, 1 and 7), Roberts, Gorkov, and Madigan (1999, Kyrgyz Republic, 2-4), Smith, Cin, and Vodopivec (1997, Slovenia, 1, 3, and 7), and Weiss and Nikitin (1998, Czech Republic, 2 and 8-10).

From these studies, we derive the t-statistics and then the partial correlation coefficients corresponding to ownership effects. The data are then combined in a generalized least squares framework to obtain a composite estimate of the effect of each of the new owners (2-11 above)
relative to traditional state ownership. These estimates of ownership effects are in the form of partial correlations, as in section 3.

The estimates of the partial correlations appear in Figure 1. These estimates reflect a process that weights more heavily those studies that have paid more attention to the issue of selection bias.\(^{26}\) We focus on this methodological issue because readers of previous versions of this paper have indicated that this is of most concern.\(^{27}\) By comparing the results that are obtained when all papers are treated equally (see Appendix) to those in Figure 1, one can examine whether the results seem particularly sensitive to selection bias. Three conclusions follow from this comparison. First, the relative position of most owners remains the same whatever the treatment of selection bias. Second, selection bias reduces the estimated magnitudes of most ownership effects. Third, only the results for managers and workers show a considerable degree of sensitivity to how selection bias is handled. Thus, our assessment of the results is that a high degree of confidence can be placed in the relative ranking that appears in Figure 1, except for some residual doubt about the positions of managers and workers, especially the former.

[Figure 1 here]

Figure 1 suggests that differences between owners are of great economic importance. Privatization to workers is detrimental; privatization to diffuse individual owners has no effect, and privatization to investment funds or to foreigners has a large positive effect. Loosely speaking, privatization to funds is five times as productive as privatization to insiders, while privatization to foreigners or blockholders is three times as productive as privatization to insiders. Foreigners were expected to make productive changes, but it is notable that investment

\(^{26}\) The weighting scale is the same as in the previous section.

\(^{27}\) Suspicions about selection bias arise naturally. Perhaps the state kept the best enterprises during privatization, or managers fought harder to retain control when prospects were good, or foreigners were willing to pay for efficient enterprises only.
funds are significantly better than foreigners and that banks and blockholders are close to foreigners. Similarly, diffuse individual ownership was not expected to be very effective, but it is surprising that it is indistinguishable from traditional state ownership.

A notable result is the difference between traditional state ownership and state ownership in commercialized enterprises, a result that recurs from Central Europe to China (Claessens, Djankov, Pohl 1997, Lee, 1999). Remember, of course, that this result is not for economies in which ownership has been developed organically for decades, but rather where ownership has been artificially transferred, sometimes to private owners who are creatures of the state. Then, if corporate governance laws are weak, share re-trading is sluggish, and the state is focused on solving economic problems, state ownership could easily be superior to some types of ownership (Anderson, Lee, and Murrell 2000b). The superiority of state ownership in commercialized enterprises over traditional state ownership might arise because the part-owners who are private are playing an important role in enterprise affairs (Frydman et al. 1999) or because the very act of commercialization changes the incentives facing the state when it intervenes into enterprise affairs (Shleifer and Vishny 1994).

A conclusion implicit in the results of Figure 1 is that concentrated shareholding produces larger effects than diffuse shareholding. This is seen most clearly in the difference between the effects of individual owners and those of blockholders, but it is also implicit in the effects of foreigners, funds, and banks since these entities usually concentrate their shareholdings. Claessens and Djankov (1999b) focus directly on the effects of concentration in their study of the Czech Republic. They show that a 10% increase in the percentage of shares held by the largest five shareholders will increase labor productivity by 5%. They also find
diminishing returns to concentration. These results are echoed in studies of Russia, e.g., Earle and Estrin (1997) and Brown and Earle (2000).

Table 5 examines statistical significance of the differences in Figure 1, reporting the values of t-statistics for standard tests of null hypotheses that one owner has the same effect as another, for all pairwise combinations of owners.28 A first inspection of Table 5 immediately reveals an unusually large number of significant t-statistics.29 This is partially a consequence of employing a methodology that combines results and embodies the precision of estimates from many studies. Just as in the previous section, we have been able to generate an unusual amount of statistical power. However, it is not the case that all owners have significantly different effects from all others. For example, workers, diffuse individual owners, and traditional state ownership cluster at the bottom, with effects that do not differ significantly. The effects of banks are significantly different from the effects of less than half the other owners, partially reflecting the fact that banks are included in few studies.

[Table 5 here]

4(b). Comparing Owners Across Regions

We have found that privatization has stronger effects in Eastern Europe than in the CIS and that different types of owners have different effects. This immediately raises the question of whether the latter could explain the former. This question would be best addressed using data on the distribution of ownership in different countries, but there is no systematic collection of such data. The available evidence does suggest that worker and diffuse individual ownership is more prevalent in the CIS than in EE, while foreign, investment fund, concentrated individual, and

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28 These test statistics are easily calculated using standard generalized least squares procedures and implicitly use the information on the variances of estimates that is extracted from the original studies.
29 The Appendix suggests using a conservative benchmark for significance, but this statement holds even under this standard.
bank ownership is less prevalent. (See, for example, Anderson et al. (2000b), Frydman et al. (1999), Brown and Earle (2000), and Claessens and Djankov (1999b).) Thus, since the CIS ownership portfolio contains a greater share of less effective owners, structure of ownership is a strong candidate to explain regional differences in the effects of privatization.

The effects of different types of owners could also vary between regions. To investigate this, the natural first step is to see whether the vectors of estimated ownership effects differ significantly between regions. The data reject the null hypothesis that ownership effects in the CIS are all the same as those in EE, at the 1% significance level. The next step then is to redo Figure 1, for each region separately.

In all cases except one (workers), the ownership effects for the CIS in Figure 2 are greater than for EE. How is this consistent with Section 3, which showed that private ownership had stronger effects in EE than in the CIS? There are two obvious reasons. First, the effect of workers is strongly negative and they own a much larger share of privatized enterprises in the CIS than elsewhere. (In Frydman et al.’s (1999) Central European sample, workers are the dominant owner in 9% of firms, while they are dominant in 50% of Earle and Estrin’s (1997) Russian sample.) Second, commercialized state ownership is separated from traditional state ownership in Figure 1 but not in Table 4. Commercialized state ownership has above average effects (relative to traditional state ownership) in the CIS and below average in EE. Thus, if one conceives of the privatization process as two steps, first the move away from traditional state ownership and then the move away from state ownership of all forms, Figure 2 and Table 1

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30 It is worth emphasizing that these results do not show that the various owners are more productive in the CIS than Eastern Europe in absolute terms. Rather, these results could just as easily be due to the relative unproductiveness of traditional state enterprises in the CIS, which are the basis for comparison.
together suggest that the first step alone was an important contribution of the privatization process in the CIS, while this was not so in Eastern Europe.\textsuperscript{31}

[Figure 2 here]

While we have treated the two regions as individually homogenous in deriving Figure 2, it should be noted that there are also large differences between the estimates for different countries within the same region. For example, Romania seems to be an outlier in Eastern Europe. Earle and Telgedy (2001) find that diffuse individual and insider ownership are surprisingly productive in Romania. Indeed, the studies for the CIS are somewhat more homogenous than those outside the CIS, as evidenced by the R-squares for the regressions that provide the data for Figure 2: 0.73 in the CIS and 0.31 outside that region. This is perhaps a reflection of the greater diversity, in history and in reform programs, within EE. Hence, Figure 2 is hardly a last answer, but rather a beginning, in a search for the reasons why different owners are more effective in some settings than others. In Section 8, we provide some discussion of this issue, examining an institutional interpretation of the patterns in Figure 2.

\textbf{5. Product Market Competition}

There is a substantial theoretical literature analyzing the relationship between competition and enterprise efficiency. The general hypothesis is that increased competition stimulates improvements in productivity. Two lines of argument support this hypothesis. The first is derived from the literature on X-inefficiency, while the second centers on industry rationalization. The X-inefficiency literature argues that managerial effort is under-supplied in the absence of vigorous competition. Horn, Lang and Lundgren (1995) show that greater

\textsuperscript{31} Lest some readers find this statement confusing, it should be emphasized that it was sometimes possible for an enterprise to pass through a privatization program and still end up with 100\% state ownership! Going through a privatization program and reduction of state ownership were not synonymous, although highly correlated.
competition induces an expansion of output by incumbent firms through improved internal technical efficiency without any reallocation of resources across firms. Earlier studies (Holmström, 1982; Nalebuff and Stiglitz, 1983) argue that incentive schemes for managers will generate better results the greater the number of players (firms) involved because of greater opportunities for performance comparison.

A second line of argument is that increased competition may lead to a rationalization of oligopolistic industries as firms are forced to compete for market share (Schmidt, 1997). Resource reallocation occurs across firms, within and between sectors. Although the shake-out may result in a transitional decline in productivity as firms with increasing returns to scale lose domestic market share, over time this may be reversed as market share expands due to exit of competitors and access to export markets. Much depends on the existence of scale economies and the ease of entry and exit.

In transition economies, increased competition may have negative effects on efficiency. Competition creates incentives for breaking contracts when institutions are weak (Blanchard and Kremer, 1997). Ickes et al (1995) suggest that excessive competition, especially from abroad, destroys network capital and harms enterprise performance in the early transition period. The former Soviet Union experienced significant losses in markets with the disintegration of the trade relations between Russia and the other former republics (Djankov and Freund, 2002). As traditional markets collapsed and as countries were opened up to foreign competition, many firms found it difficult to restructure their product lines and at the same time reorient their sales towards new markets.

The empirical literature outside of transition economies yields a mixed picture on the relationship between competition and enterprise efficiency. Few empirical investigations using
firm-level data have established a strong link between greater competition and subsequent changes in enterprise performance. Two studies of British manufacturing firms (Nickell, Wadhwani and Wall, 1992; Nickell, 1996) use a panel to show that market concentration has an adverse effect on total factor productivity. In contrast, Blanchflower and Machin (1996) find no effect of changes in domestic market structure on the productivity of British plants. Januszewski et al (2001) use a sample of publicly-listed German companies to show that neither import competition nor domestic market competition have beneficial effects on TFP growth. Studies on developing countries also find ambiguous results. Harrison (1994) finds that a reduction of tariffs in Cote d’Ivoire and the subsequent increase in import penetration had an insignificant effect on TFP growth. In contrast, Van Wijnbergen and Venables (1993) find a strong positive effect of increased import penetration on labor productivity in Mexican manufacturing firms.

The initial period of transition provides a unique opportunity to test the importance of product market competition. A majority of transition economies rapidly liberalized their trade regimes. Many went on to de-monopolize their industrial sectors by breaking up conglomerates, spinning off individual production units, and allowing entry of new private firms (Djankov and Hoekman, 2000; Lizal et al., 2001). The short period in which these changes took place allows the researcher to identify the timing of the policy change and to control for other economy-wide and firm-specific factors that influence the change in productivity.

We find 23 studies that explicitly investigate the effect of product market competition on enterprise restructuring. Among those, 13 focus on EE countries (Claessens and Djankov (2000); Dobrinsky et al (2001); Djankov and Hoekman (2000); Djankov and Hoekman (1998); Grigorian (2000); Grosfeld and Tressel (2001); Hersch, Kemme, and Bhandari (1994); Halpern and Körösi

32 On the macro level, Rodriguez and Rodrik (1999) survey the literature on open trade policies and economic growth and conclude that the evidence that openness is associated with growth is very weak.
(1998); Könings (1997); Könings (1998); Markov et al (2000); Shirley and Xu (2001); Warzynski (2001a)) and 10 use data for either Russia (Angelucci et al (2001); Brown and Brown (1999); Earle and Estrin (1998); Brown and Earle (2000); Kuznetsov et al (2002); Perevalov et al. (2000)), Georgia (Kreacic, 1998), Ukraine (Warzynski, 2001b), Mongolia (Anderson, Lee, and Murrell, 2000b), or all transition economies (Carlin et al, 2001). We are able to distinguish 82 separate analyses, where the authors use either different measures of enterprise restructuring (total factor productivity levels or growth rate, labor productivity level or growth, sales growth, and qualitative variables like renovation of facilities) or different indicators of competitive pressures. Twenty-eight analyses use import competition as the main explanatory variable, while fifty-two focus on domestic market structure.

The analyses are fairly homogeneous. In most cases, the dependent variable is quantitative: 55 analyses use TFP as the indicator of enterprise restructuring, 19 use labor productivity, and two use sales growth. Six analyses, all derived from Kreacic (1998), use qualitative indicators of restructuring (facilities renovation, establishment of a marketing department, and computerization of the accounting function). Import competition is proxied by the import penetration ratio (20 analyses), or the industry-level tariff rate (8 analyses). Domestic market competition is measured by either the Herfindahl index (25 analyses), the percentage of sales revenues of the top 2, 3, or 4 firms in the respective industry (15 analyses), the number of local competitors that enterprise managers perceive as rivals (12 analyses), or the change in the enterprise’s own market share (2 analyses).

Some explanatory variables raise the issue of endogeneity. In proxying for the level of domestic competition, Hersch et al (1994) ask enterprise managers to “categorize the number of other firms now producing in your main domestic market as either none, 1 to 10, 11 to 50, 51 to
100, or more than 100” (p.358). Grosfeld and Tressel (2001) use lagged own market share. Both variables are problematic since the number of competitors or one’s market share may be endogenous to the performance of the enterprise. Accordingly, when we aggregate the empirical analyses using weights we assign a weight of 1 to both studies for “attempts to handle endogeneity.” Studies using the Herfindahl index, e.g., Könings (1998), avoid this problem and are given a rating of 3.

The endogeneity problem is also present in studies that use manager perceptions of import competition or the import penetration ratio as a measure of competition from abroad. The former suffers from obvious endogeneity while the second depends on the volume of imports, which is endogenous to the performance of the producers in the domestic sector. Accordingly, we assign a value of 1 for handling endogeneity to studies that use perception of import competition, e.g., Konings (1997), a 2 to all analyses that use import penetration, e.g., Angelucci et al (2001), and a 3 for all analyses that use changes in the statutory tariff rate, e.g., Djankov and Hoekman (2000). The endogeneity ratings are also reflected in the overall quality rating.

Table 6 illustrates the variety of analyses in terms of country samples, the choice of dependent and explanatory variables, and the economic effects of competition on enterprise efficiency that the authors find. Angelucci et al (2001) study the effect of competitive pressure on firm performance in Romania, using panel data from 1997 to 1998.33 The study finds that a 10 percentage points reduction in the Herfindahl index results in an increase in TFP growth of 19.1%; a 10 percentage points increase in import penetration results in a TFP growth loss of 6%. The negative effect of competition is particularly pronounced for state-owned enterprises, and is insignificant for privatized firms. The authors conclude that the technology gap between

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33 The study also uses a large panel of Polish firms. As the data cover both small and large companies, they are not used in our analysis.
domestic firms and importing rivals may have been too wide and thus acted to discourage enterprise restructuring. In effect, domestic (state-owned) firms are priced out of their markets. [Table 6 here]

Grosfeld and Tressel (2001), using a panel of 153 Polish firms, find that the reduction in own market share by 10 percentage points results in 1.4 percentage points increase in productivity growth. Again, this effect is stronger for privatized firms. The results are robust to the use of alternative estimation techniques, and the inclusion of controls for ownership concentration and ownership types. The evidence supports the view that competition-enhancing policies and privatization should be pursued simultaneously.

The analyses indicate that product market competition has been a major force behind improvements in enterprise productivity in transition economies as a whole, as shown in Table 7A. When we divide the sample into analyses based on import competition versus domestic market structure (for all countries together), we find that each is generally significant in explaining enterprise performance. The effect of domestic market structure is always significant. Import competition is insignificant in explaining enterprise restructuring when giving less weight to studies that do not confront endogeneity problems. Examining the results by region, the effects are strong for EE countries, where in all cases the t-statistics are significant at conventional levels. For CIS countries, increased competitive pressures are not associated with enhanced restructuring.

A further sub-division of the analyses shows an interesting pattern: import competition in the CIS countries does not have a significant effect on enterprise restructuring and has a negative sign. In contrast, import competition is significant in explaining enterprise restructuring in the EE sample, with t statistics varying between 3.37 and 4.15. Since all the Russian studies use
import penetration variables that are region-specific, it would not be correct to conclude that this
difference is due to the fact that Russia has a larger internal market and the effect of import
competition may be muted or imprecisely measured. What explains this difference then? The
evidence is consistent with the theoretical predictions in Blanchard and Kremer (1997) and Ickes et al (1995). In the CIS, the rapid opening to competition from abroad acted to deter domestic
restructuring. Perhaps a gradual approach to trade liberalization is the preferred policy choice.

Changes in domestic market structure are important in explaining enterprise restructuring in
both the CIS and EE samples. (The exception is in the CIS when we weight according to
attention paid to endogeneity bias.) These results are upheld in a study of over 3,300 enterprises
in 25 transition economies (Carlin et al, 2001) that shows strong positive effects of the reduction
of market concentration on firm efficiency. The significant effect of changes in domestic market
structure on enterprise restructuring in the CIS resonates with recent evidence on high barriers to
entry in transition economies. Djankov et al (2002a) document the number of procedures, and the
associated time and cost, for starting a new business in 85 countries around the world, including
22 transition economies to explain poor aggregate growth performance in the CIS. Establishing a
new business in Russia or Ukraine takes twice as much effort, time, and money than a start-up in
Eastern Europe, and three times longer than establishing a new business in Latvia or Lithuania.
The authors argue that entry barriers serve to impede product market competition. Similarly,
Shleifer and Treisman (2000) documents the presence of significant geographic segmentation in
Russia and lackluster competition at the regional level.

[Table 7 here]

Table 7B examines the statistical significance of the variation in the effect of product market
competition across regions and across types of competition. In the first panel, we show
competition from local producers has a stronger effect than import competition, but the difference is not statistically significant. The second panel shows that competition has a stronger effect in explaining enterprise restructuring in EE countries than in CIS countries and that this difference is statistically significant when weighting for attempts to handle endogeneity, and when controlling for the overall quality of the paper. The third panel compares the relative importance of foreign competition in the CIS and EE countries, suggesting that foreign competition has a large positive effect in Eastern Europe and the Baltics and a large negative effect in the CIS countries. The last panel shows that there are no discernible patterns in the way in which the effects of domestic market structure differ between the CIS and EE countries.

The findings on the effect of import competition deserve special attention. In the CIS, import competition has a large negative effect in economic terms, although this effect is statistically not robust. In Eastern Europe, import competition has a positive effect in economic terms, but the results of the individual studies are mixed, consistent with the literature on other developing economies.

6. Soft Budgets

The concept of soft budget constraints was coined by Janos Kornai (1979, 1980) to explain shortages in socialist economies, especially in the market socialist system. Kornai describes the soft budget phenomenon as “firms are bailed out persistently by state agencies when revenues do not cover costs” (Kornai, 1998, p.12) and defines soft budgets as “the expectation of the decision-maker as to whether the firm will receive help in time of trouble…” (Kornai, 1998, p.14). Joseph Stiglitz further narrows the definition to situations when “enterprises believe that any losses they incur will be made good by the government” (Stiglitz, 1994, p.184).
Two alternative theories explore the causes of soft budgets. Kornai (1979, 1980) relates the softness of budget constraints to the paternalistic attitude of the government, which results in the accommodation of enterprise requests for new finance. Firms are financed even when the expected new project’s return is below the real interest rate. The government’s goal is to provide economic security for enterprise employees and supply social services (kindergartens, schools, hospitals, recreation facilities) in the enterprise.

A different reason for the existence of soft budgets is advanced in Shleifer and Vishny (1994) and Boycko et al. (1996). These papers model bargaining between politicians and managers, which leads to equilibria with subsidies to firms and excess employment. Politicians use government subsidies to induce firms to maintain a higher-than-efficient level of employment in order to enlarge their own political constituency. Since the model predicts that subsidies increase when there is a decline in enterprise profits, these political decisions constitute a soft-budget policy regime.

These two theories of the causes of soft budgets differ significantly. The first explains accommodating lending behavior determined by concerns of social stability, while the second suggests that soft budgets arise from politicians’ narrower self-interest. In both, soft budgets

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34 A third theory, relevant for both transition and developed market economies, views soft budgets as the continued extension of credit even when the substandard performance of an already-financed investment project has been revealed (Dewatripont and Maskin, 1995; Maskin, 1999). Because of asymmetric information, even poor projects are initially financed. By the time creditors can observe project quality they will continue to lend, because refinancing may still maximize the expected value of funds that can be recovered. A fourth theory, advanced in Stiglitz (1994), suggests that soft budgets arise when financing institutions have an incentive to make large gambles. In this model, an insolvent bank is willing to invest in a risky project with low or even negative expected payoff, because the bank will become solvent if the gamble pays off; and if the gamble doesn’t pay off, the bank will be no worse off than it was before it made the loan, i.e., it will still be insolvent. We do not discuss these two theories in the context of soft budget constraints in transition, because the source of soft budgets here is a (private) financial institution, not the government.
compensate the enterprise for keeping surplus employment. The predicted effect on enterprise restructuring from soft budgets is lack of productivity improvements and continuation of unprofitable production (and non-production) activities.

The theoretical literature suggests that an empirical measure of the incidence of soft budgets needs to satisfy two criteria. First, it has to capture the expectations of enterprise managers of a future government bail-out, not the current policy of the government. Imprudent behavior of managers that results in poor enterprise performance can occur in enterprises that have not yet received government subsidies but expect to do so when they are in trouble. Also, enterprises that have received subsidies in the past may not expect those to continue in the future, perhaps as a result of new government policies. Second, the expectation of government support is contingent on the enterprise being in financial distress. Both Kornai’s theory and the Shleifer-Vishny-Boycko model show that without the fear of imminent job losses, i.e., if the enterprise is solvent, there is no reason for the government to extend new financing to the enterprise.

Few empirical papers meet these criteria for measuring soft budgets. The study that comes closest to the prescribed measure is Anderson et al. (2000a). They survey 249 enterprises that underwent Mongolia’s mass-privatization program by mid-1995, asking enterprise managers what proportion of lost revenues the state would make up if losses threatened the enterprise’s ability to maintain its employment level.36 The resulting measure of soft budgets is expectational

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35 In Shleifer and Vishny (1994) there are several types of equilibria, depending on whether bribes occur and on the nature of property rights. The effect of a decline in profits is either an increase or no change in subsidies, depending on which equilibrium pertains.

36 The question was phrased as follows: “Suppose that unfortunate market conditions resulted in a sudden drop in your enterprise’s revenues, so that you might have to lay off workers. How likely is it that the government (either national or local) would help your enterprise out, so that it would not be forced by its financial situation to lay off workers? Please indicate your expectation of the likely government reaction by choosing a point on the scale from 0 to 10 – a “0” means that you think the government would do absolutely nothing to help out and a “10” means that you think the government would completely make up for the decline in revenues in some way, and a “5” means that the government would make up half the
in nature, and the expectations are limited to the situation where the enterprise has lost revenues. Almost three-quarters of the surveyed enterprise managers, 73.1%, thought that the government would do nothing to help out, 2.4% of managers thought that the government would bail them out completely, and 13.6% of managers thought that the government would make up at least half of the decline in revenues. The perceived degree of budget softness was shown to be strongly correlated with the amount of central government ownership. Almost half of the enterprises with majority central government ownership expected some financial assistance, while 31.3% of the managers of these enterprises expected that the government would make up at least half the decline in revenues. The data on managers’ expectations is used in Anderson et al (2000b) to study the effect of soft budgets on enterprise performance.

While theoretically most appropriate, the expectational measure used in Anderson et al is not easily replicable in other studies since it relies on a survey instrument designed for studying the soft budgets phenomenon. In the absence of such data, other authors use quantitative variables that proxy for the expectations of enterprise managers, while different variables are used to control for the financial distress of the enterprise. The best example of this approach is Li and Liang (1998), who construct indicators of soft budgets from survey data on employment of non-production workers, investment with below-average rates of return, and distribution of bonuses in excess of those regulated by the Chinese government. All three factors are shown to contribute to the financial distress of the enterprise. Using a sample of 681 enterprises for the period 1980 to 1994, Li and Liang find that if all of the non-production workers, defined as workers with zero marginal product (such as cleaners, political counselors, etc.), were eliminated, 38% of financial losses would be avoided. As another example, excessive bonuses

decline in revenues. Choose any number between 0 and 10, indicating your expectation concerning the extent to which the government would help out” Anderson et al (2000a, p. 222).
accounted for 39% of total enterprise losses. The empirical question that the authors ask is whether enterprises respond to financial losses, defined as negative cash flows, by reducing any of the factors that cause these losses initially. The answer is No. All enterprises in financial distress expected to be bailed out by the government.

Several other papers illustrate the difficulties in constructing a soft budget proxy in the absence of survey data. These studies rely on data from the financial statements of enterprises. Abdelati and Claessens (1996) and Coricelli and Djankov (2002) use samples of over 4,000 Romanian companies and distinguish among chronic loss-makers and adjusted enterprises. Chronic loss-makers are defined as enterprises with negative cash flows during the 1991 to 1994 period. Adjusted enterprises are defined as enterprises that had negative cash flows in 1991 or 1992 or both, but then recorded positive cash flows in 1993 and 1994. The proxy for soft budgets is the amount of new bank financing, net of accrued interest expenses. Since the banking system was fully in state hands in 1994, the proxy measure identifies the major channel of government funding, as tax arrears and direct government subsidies are shown to be small relative to the flow of new credit. The authors seek to answer the question whether chronically loss-making enterprises received financial support in order to keep employment as high as that of profitable enterprises. The answer is Yes. In fact, during the sample period, loss-making enterprises received about 50% more bank credit as a share of revenues and shed less labor than did adjusted firms. Assuming that the government would continue its policy of keeping loss-making enterprises afloat, these studies provide empirical support for the presence of soft budgets. Claessens and Peters (1997) use a similar approach to study the effect of soft budget constraints in Bulgaria. They use trade arrears to other state enterprises, and the share of external financing
in total assets, as alternative proxies for soft budgets. The dependent variable is the change in value added.

Earle and Estrin (1998) use data for about 300 Russian enterprises during 1990 to 1994 and construct a measure of government assistance to enterprises, which they interpret as a proxy for soft budgets. The measure relies on flow-of-funds data and includes all possible channels of government support, such as federal subsidies and investments, tax benefits, preferential credits, extra-budgetary funds, tax exemptions and other benefits associated with foreign trade, and local government subsidies and tax arrears. In addition to relying on a current policy proxy, the analysis does not capture the financial distress of the enterprise, making the results difficult to compare with the theories of soft budgets. For example, product specific subsidies, often the result of price controls, can be given to both profitable and loss-making enterprises. Studies using such data document the effect of distortions due to price controls as much as the incentives of soft budgets.

Earle and Estrin are in good company. Claessens and Djankov (1998), Djankov and Hoekman (2000), Grigorian (2000), and Carlin et al. (2001) use similar variables as proxies for soft budgets. This pattern is in part explained by the fact that all five studies focus on the effects of ownership changes and use the soft budgets proxy only as a control variable. We include these studies in the survey since they provide valuable information on the incidence of government financing of loss-making enterprises in transition economies, and some of the effects that this financing has. If anything, our criticism of their approach reflects the dearth of research focused on the soft budgets issue.

The studies discussed so far document numerous channels of government support for ailing enterprises. While Abdelati and Claessens (1996) and Coricelli and Djankov (2002) identify
new credit from the state-owned banking sector as the main conduit of soft budgets in Romania
during the early transition period, and Claessens and Peters (1997) finds similar results for
Bulgaria, Schaffer (1998) shows that bank lending was not a major source of soft budgets in
Hungary during the early transition period, even before the banking sector was privatized. once
the Hungarian banking system was largely privatized by 1995, bank credit was restricted to
profitable projects (Claessens and Djankov 1998). Tax and social security arrears to the central
government were the main source of soft financing in Poland in 1993, while trade credit was not
a source of soft budgets in either Hungary or Poland.37 These results are reflected also in
Claessens and Djankov (1998) who find that, by the mid-1990s, financing of loss-making
enterprises by the still state-owned banking sector was the primary channel of soft budgets in
Bulgaria, the Czech Republic, Romania, Slovakia, and Slovenia, but not in Hungary or Poland.
Not coincidentally, by the end of the 1990s all of these countries have experienced severe
(Bulgaria and Romania) or at least significant (the Czech Republic, Slovakia, and Slovenia)
banking crises.

Shleifer and Treisman (2000) show that tax exemptions by the local government are the
main channel of soft financing in Russia, as do Alfandari et al. (1996) and Brown and Earle
(2000). Direct subsidies from the central government are an important source of soft budgets in
Kazakhstan (Djankov and Nenova, 2000) and Lithuania (Grigorian, 2000). Finally, Gao and
Schaffer (1998) show that credit is always available to loss-making state enterprises in China.

What is the economic significance of hardened budgets on enterprise restructuring? In
addition to the results already discussed, Li and Liang (1998) find that if all inefficient

37 Overdue trade credit between private enterprises should not be considered as evidence of soft budgets. Also, McMillan and Woodruff (1999) show that private trade creditors in Vietnam stop financing enterprises once their payments are two months in arrears.
investment projects were eliminated, the average enterprise’s profit margin would change from 8.7% to 2.3%. Claessens and Peters (1997) find that the presence of soft budgets in Romanian enterprises results in a reduction of labor shedding by 4% annually during 1992 to 1994. Coricelli and Djankov (2002) find that labor shedding was reduced by 4.6% during 1993-1995. Claessens and Djankov (1998) find a 2.7% unrealized TFP growth as a result of continued soft financing in the Eastern European countries. Djankov and Hoekman (2000) find an unrealized annual growth of 3 percentage points in Bulgaria over the 1992-1995 period. Earle and Estrin (1998) find a 5.7% unrealized labor productivity growth. Alfandari et al. (1996) show that recipients of soft financing record labor productivity growth that is 6% less than that of non-recipients. Finally, Abdelati and Claessens (1996) find that a one-standard-deviation increase in the flow of financing from state banks in Romania is associated with a 14.2% unrealized labor productivity growth per annum. This evidence suggests that soft budgets are a major deterrent of enterprise restructuring.

We next turn to a discussion of the statistical significance of the results on soft budgets. We discuss the results of 10 papers that use regression analysis to answer these questions. The data come from Bulgaria (Claessens and Peters, 1997; Djankov and Hoekman, 2000), Kazakhstan (Djankov and Nenova, 2000), Lithuania (Grigorian, 2000), Romania (Abdelati and Claessens, 1996; Coricelli and Djankov, 2002), Mongolia (Anderson, Lee, and Murrell 2000b), Russia (Earle and Estrin, 1998), and cross-country studies of the seven Central and East European countries (Claessens and Djankov, 1998) and 25 transition economies (Carlin et al., 2001). They cover the period between 1992 and 1999, and contain 31 separate analyses.
Before discussing the aggregate results, however, we acknowledge the simultaneity problem that plagues most empirical work on soft budgets.\textsuperscript{38} Theory suggests that poorly-performing firms get bailed out, while good firms do not receive government financing since they don’t need it. Researchers want to examine whether soft budgets cause poor performance, yet the data may be overwhelmed by the relationship operating in the other direction. Researchers have addressed this problem in various ways, but none is entirely satisfactory. Weighting papers by a subjective measure of how the authors have handled the simultaneity bias, and by the overall quality of the empirical analysis gives some perspective on the importance of the problem, but does not eliminate it.

Table 8A shows that the effect of hardened budgets on enterprise restructuring, defined as sales growth, TFP, or labor productivity, is very significant in EE countries and generally significant in CIS countries. The positive signs imply that hardened budgets have a beneficial effect on restructuring. Table 8B compares the size of the hardened budget effect across the two regions. The studies on EE and CIS countries show effects of similar magnitude, as the t-statistics are insignificant.

How can soft budgets be limited? Both Kornai and Shleifer-Vishny suggest, and the empirical literature shows, that privatization of enterprises is the main policy choice. Anderson et al (2000a) show that a 10% larger share of central government ownership increases by 9% the probability of receiving soft financing. Their estimates suggest that privatization reduced the percentage of enterprises with soft budgets from 78% to 23%. Similarly, Alfandari et al. (1996) show that the probability of receiving state support is reduced in half if the enterprise is private.

\textsuperscript{38} We owe this point to Mark Schaffer.
Frydman et al (2000) find evidence to suggest that hardening budgets induces cost efficiency but not revenue restructuring, and that the only policy for the Czech, Hungarian, and Polish governments to commit to hard budgets was through privatization of enterprises. Without privatization, it is often rational for the government to extend assistance to loss-makers.39

The literature surveyed here also shows that larger state-owned enterprises are more likely to be the recipients of soft financing. This implies that policies that reduce the role of industry giants (through de-monopolization, split-ups, or spin-offs) will also reduce the presence of soft budgets (Lizal et al, 2001).

Other findings are less robust. Privatizing the banks may bring about a reduction in soft financing. A study of 92 economies, including 11 transition economies, shows that government ownership of banks is associated with lower TFP growth in the enterprise sector, stemming from inefficient allocation of resources across enterprises (La Porta, Lopez-de-Silanes, and Shleifer, 2002). Beware of the Stiglitz (1994) model, however. There are many examples of private banks extending soft credits to enterprises as part of their own survival-through-gambling strategy. Finally, the decentralization of the government budget and decision-making seems to have limited soft budgets in China (Qian and Roland, 1996) and Mongolia (Anderson et al. 2000a) but served to increase the incidence of supporting failing enterprises in Russia (Blanchard and Shleifer, 2000; Zhuravskaya, 2000). Further empirical research is needed to be more definitive on the effects of bank privatization and fiscal decentralization.

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39 One example: A policy of offering generous severance pay for workers was tried in Romania in 1992 to 1994. Employees of large loss-making enterprises were offered 12 months of wages as severance. However, the government continued the flow of soft financing to large loss-making enterprises even after severance packages were offered, thus dooming the initiative to failure (Djankov, 1999b).
7. **The Role of Managers**

Economic theorists have taken two broad approaches in assessing the role of managers in improving corporate performance. One focuses on manager incentives. Jensen and Meckling (1976) hold that managers want to pursue projects or consume perquisites that benefit them personally. This argument is based on the observation that in most modern corporations, as shown in Berle and Means (1933) and more recently in La Porta, Lopez-de-Silanes, and Shleifer (1999), ownership is separated from control and hence managers (who have the control rights) do not bear the consequences of their actions. A variation of the agency problem, developed in Holmström (1979), studies unobservable managerial effort. When owners cannot judge how hard managers work, there is an incentive for managers to slack off. The implication of both theories is that when manager ownership is high, managers will act so as to increase enterprise efficiency.\(^{40}\)

Theoretical models on the early transition, e.g., Aghion et al. (1994) and Aghion and Blanchard (1996), follow the incentive literature by showing how the incentives of managers to behave in a profit-maximizing manner improve once they hold a significant stake in the performance of their firms.\(^{41}\)

A second theory focuses on management turnover (Rosen, 1992). The theory stipulates that if the manager is not capable or knowledgeable, no amount of incentives will do. In such instances, it is better to bring in a new manager. Barberis et al. (1996) apply this theory to data on Russian shops and find that the hiring of new managers brings about significant improvements in enterprise performance, while giving incentives to old managers does not.

\(^{40}\) In both theories, the optimal level of managers’ ownership is below 100% if managers are risk averse (Morck, Shleifer, and Vishny, 1988).

\(^{41}\) Furthermore, career concerns may lead managers of state-owned enterprises to restructure if privatization in the economy is imminent or under way, since privatization creates a market for managers and hence increases managers’ incentives to outperform their peers (Roland, 1994; Roland and Sekkat, 2000).
In this section, we survey the literature that has studied government policy affecting the role of managers in improving enterprise performance in transition. Unlike the studies on western firms where corporate boards design manager incentives and fire managers for bad performance, the transition literature on managers to-date has focused primarily on government policies. Many of the studies discussed here use data on Chinese enterprises. There are few studies that test the theories of manager incentives and manager turnover in Central and Eastern Europe or the former Soviet Union. This disparity is a reflection of the policies taken by the Chinese government at the outset of economic reforms. Privatization was not seen as an option and instead the government sought to improve the performance of state-owned enterprises by giving their managers more autonomy and better incentives (Naughton, 1994).42

The decision to provide more autonomy and better incentives in China started in 1978 as an experiment in the agricultural sector (McMillan, Whalley, and Zhu, 1989). It was quickly emulated in manufacturing (Lee 1990). The evidence shows that managers responded to the new autonomy by strengthening the discipline imposed on workers, by increasing the proportion of workers’ income paid in the form of bonuses and the fraction of workers on fixed-term contracts (McMillan and Naughton, 1992). Enterprises also spent more on productive investment (Groves et al., 1994).

The incentive system let state enterprises retain profits, separated management from politics, and allowed managers to be treated as individual contractors, and their pay and bonuses to be linked to the performance of their units. These changes in incentives were so fundamental, that the process is sometimes called “privatization from below,” e.g., Naughton (1994, p. 266). The

42 The Polish government followed a similar policy in the first years of transition (Pinto et al., 1993).
policy was designed to give managers control rights, contingent on keeping government ownership intact.

The move to autonomy in decision making at the enterprise level may account for a large part of the estimated effect on enterprise restructuring. The autonomy effect needs to be controlled for, in order to estimate the effect of incentives per se. Fortunately, most of the studies that we survey use separate variables for the autonomy component of the responsibility system, e.g., Lee (1990), Groves et al (1994), Gordon and Li (1995). The simultaneous introduction of several policies within the responsibility system also makes it difficult to differentiate the effect of manager incentives from that of manager turnover. Indeed, “stronger incentives and better managers are complementary changes. They might be so strongly complementary that neither change would be effective by itself. Some managers might be so inadequate as to be unable to respond to new incentives, no matter how well designed. Good managers might not work well under badly structured incentives. If so, restructuring is effective only if both changes – new managers and new incentives – are introduced together” (McMillan, 1997, p.7). We try to give the reader some sense of the relative importance of turnover versus incentives, but one should consider them two parts of a single policy.

The measurement of incentives creates some problems. While data on equity ownership and salaries of managers do exist and have been used in a number of studies, data on stock options and bonuses are less readily available. Yet these types of incentives may account for a large part of the manager’s decision to stay with or join a particular firm and work hard on improving its performance. However, liquid capital markets are rare in transition economies (Claessens, Djankov, and Klingebiel, 2000), and stock options are not much used. Bonuses or management pay linked to enterprise performance are used in all transition economies (Jones and Kato, 1996).
In China, bonuses or, in the case of enterprises with auctioned management positions, bonuses based on the bid price of the new manager are used in 97% of enterprises (Gordon and Li, 1991). However, outside of China, we could not find any empirical studies using such data.

The earliest study on management incentives and enterprise performance in China is Lee (1990), which constructs dummies of whether the enterprise has implemented a) all incentive reforms; or b) any one of these reforms. The results indicate that the adoption of all reforms yields about a 4% total factor productivity increase, while accounting for other firm characteristics such as the initial productivity level, export orientation, the ratio of non-managerial to managerial employees, and the ratio of temporary workers to total employment.

Groves et al. (1995) show that management incentives improved profitability in Chinese enterprises by 7.3 percentage points and that managers benefited significantly from this improvement: the average pay with new incentives was 37.4% higher than their previous salary. Using the same data set to construct a 10-year panel, Groves et al (1994) show that bonuses are positively associated with productivity in five manufacturing industries: textiles, chemicals, building materials, machinery, and electronics. In all but one, chemicals, this association is statistically significant. Gordon and Li (1995) and Li (1997) also find manager incentives to be effective in increasing total factor productivity in China. Both papers control for the timing of decentralization, as well as for non-linearities in the production function. Using data for 1983 to 1987, Gordon and Li find that firms implementing manager incentives experienced an additional 17% increase in productivity beyond that found for other firms. Li (1997) finds that an increase in bonuses by one percentage point raised the TFP growth rate by 0.089 percentage points between 1980 to 1984, and by 0.060 percentage points between 1985 and 1989. Similarly,
Chang, McCall, and Wang (2001) find manager incentives to be associated with a 4% increase in the return to equity, using a panel data set of 80 agro-processing enterprises from 1984 to 1993. In contrast, Broadman and Xiao (1997) find a positive but generally insignificant effect of incentives on labor productivity in the early reform period, 1980 to 1985, and Shirley and Xu (2001) document a negative but generally insignificant relation between manager performance contracts and TFP growth in Chinese state enterprises. Claessens and Djankov (1999b) use data on stock ownership in publicly listed Czech companies and fail to find evidence of the effect of manager incentives on enterprise performance. However, all three papers lack good proxies for manager incentives. For example, Broadman and Xiao do not have data on managerial wages and bonuses and use the gross value of non-industrial fixed capital as a proxy for in kind compensation. Shirley and Xu use a dummy variable for the presence of a performance contract as a proxy, but cannot differentiate among contracts that offer generous bonuses based on performance and contracts that are merely window-dressing.

We turn to the effect of manager turnover next. The seminal study in the transition literature linking manager turnover and enterprise performance is Groves et al. (1995). They use a sample of Chinese state-owned companies to investigate the link between manager turnover and TFP growth. Poorly performing firms are more likely to have a new manager selected by auction, and such managers are required to post a higher security deposit and are subject to more frequent performance reviews. Managers are frequently fired for poor performance and in such cases often lose part of their security deposit. The incidence of turnover during the sample period of 1980 to 1989 is very high. Only 11% of managers in place in 1980 remained managers by the end of the period, and almost half (44%) of managers were appointed after 1985. These changes

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43 Auctions for managerial jobs took place in 14% of the sample enterprises.
are primarily a reflection of the functioning of the market for managers: only 25% of turnover is the result of retirement. The economic effect of replacing bad managers is high: new managers bring about a 16% increase in labor productivity.\textsuperscript{44}

The literature on the effects of changes in managers in Central and Eastern Europe and the former Soviet Union suffers from an acute problem: management turnover often takes place as an endogenous decision after privatization. New owners pick new managers and the effect of management change is confounded with ownership change, especially when the new owners themselves are the new managers. For example, the retail shops studied in Barberis et al. (1996) are in many cases manager-owned. Even for mid-size and larger enterprises, managers may be large owners (Kuznetsov, Mangiarotti, and Schaffer, 2002) and hence lose their jobs when there is ownership change.

The data set in Claessens and Djankov (1999b) is well suited for empirical testing of the importance of management turnover. First, the privatization process in the Czech Republic prevented incumbent managers from obtaining significant ownership. As a result, management changes were separated from ownership change. The data display high turnover: 35.6% of managers in privately owned enterprises and 42.1% in those under state ownership. The authors construct dummy variables for enterprises without management changes, for enterprises where managers were replaced while under state ownership, and for privatized enterprises where the new owners hired new managers. These dummies are used alongside variables for the initial labor productivity level, the enterprise size, and manager’s equity ownership to explain differences in annual labor productivity growth rates. Labor productivity growth increases by

\textsuperscript{44} Shirley and Xu (2001), using the same dataset for 1986 to 1989, also find the economic effect of manager turnover to be quite high: a new manager brings about 4 percentage points higher TFP.
4.2% with the appointment of a new manager in privatized enterprises. The appointment of new managers in state-owned enterprises yields a 3.5% increase in labor productivity growth.

In a similar study, Frydman, Hessel, and Rapaczynski (2000) use a sample of state-owned and newly privatized enterprises in the Czech Republic, Hungary, and Poland to study management turnover and its effect on the annual rate of revenue growth during the period 1991 to 1993. The turnover rate was extremely high: nearly two-thirds (64%) of managers were dismissed or moved voluntarily. Managers changed in 75% of state-owned enterprises, in 72% of enterprises with a dominant outside owner, and in 55% of insider-owned enterprises. In state-owned enterprises, management turnover is associated with a 3.1% increase in revenue growth, but this effect is statistically insignificant. In privatized enterprises, the effect is much larger, at 18.5%, and statistically significant. Using the same methodology in a study of large Ukrainian firms, Warzynski (2001b) finds that management turnover does not affect the change in productivity in state-owned enterprises, but has a small positive effect in privatized enterprises.45

[Table 9 here]

The studies reviewed in this section show that manager incentives work and management turnover is almost always effective in improving enterprise performance. To understand the composite implications of these studies, we combine the regression results from 12 studies with 33 separate analyses, testing the importance of both managerial turnover and managerial incentives in restructuring (Table 9).46 We find that in all cases manager incentives and turnover, considered together, are an important determinant of restructuring. The pertinent t-statistics have values between 8.19 and 9.46. Separately, manager turnover and manager incentives

45 The turnover was higher in state-owned enterprises, where 60.7% of management positions changed hands in 1993-1997, than in privatized enterprises, with 47.5% of management turnover.
incentives also have significant effects on restructuring. Panel B directly compares the two size of the economic effects. There is no statistically significant difference, indicating that management turnover can be as effective as manager incentives for enterprise restructuring. Note, however, that the evidence on incentives comes from China alone, and that this result seem to be much weaker in countries where incentive policies are not used as a substitute for ownership change (Qian, 1999). In such countries, the evidence here shows that privatization has a large and significant effect on performance, while manager-related variables usually do not have statistical significance (Warzynski, 2001b).

Before concluding this section, we suggest one avenue for further research on manager incentives in transition. It is striking that the literature has not studied the presence of penalties (disincentives) for managers in the event of poor performance, asset-stripping, or spending enterprise resources for personal enrichment. While we have not been able to find any empirical literature on this topic, a multitude of press reports on China suggest that the government has imposed harsh penalties, include the death penalty, for enterprise managers who abuse their power, e.g., China Daily (2000). In contrast, the literature on Russia suggests that the central government was unable to impose any such disciplines (Shleifer and Treisman, 2000). The presence of such “sticks” may be an important determinant of the apparent positive effect of manager incentives in China (Qingtai, 2001). In an environment where negligent or fraudulent behavior by managers is severely punished, when uncovered, managers have the choice of working hard and getting bonuses or slacking off and living off their salary alone. In contrast, where bad behavior goes unpunished, managers have the choice of stripping enterprise assets and getting a huge windfall now, as opposed to working hard through the years and receiving better

46 The construction of Panel A employs the method used in Table 2, while the construction of panel B uses the method of Table 3.
compensation through bonuses. The evidence in Black et al. (2000) shows that many Russian managers pursue the former path.

8. The Future Research Agenda

In aggregating the results of the many papers that examine the determinants of enterprise restructuring, we have arrived at strong conclusions. Given the number of analyses being aggregated, almost 600 in total, it is unlikely that any new study would modify these conclusions significantly unless its whole approach constituted a new departure.

Many of the studies under review were stimulated in part by the easy availability of new types of data, which opened up whole new avenues of enquiry. The design of the studies was not driven by attempts to address difficult methodological problems, by efforts to examine the effects of less easily quantifiable aspects of policy, such as the nature of institutions, or by considerations that viewed transition in the wider context of development. In the future, the most productive research will focus directly on these three issues. In the ensuing subsections, we discuss each of the three.

8(a). Selection, Simultaneity, and Complementarities

In designing a new research project that examines those determinants of restructuring that we have already reviewed, what should the central focus be? Our reading of the concerns of fellow researchers is that the most important source of skepticism about existing results centers on the possible biases in estimates that might arise either from simultaneous causation or from the selection of enterprises to be subjected to some policy. We have focused on this issue in the previous sections and we have argued that our conclusions are robust to such bias. However, we

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47 This is a general characterization to which there are notable exceptions. For example, Hellman, Jones, and Kaufmann (2000) and Carlin et al (2001) sought measures of non-standard enterprise determinants.

48 When focusing on deficiencies in the literature, we should make it clear that our own papers are not exempted from such criticism.
sense enough residual concern over this issue to suggests that there is a large payoff from any study that goes beyond the methods employed in the existing literature.

A study aimed at quelling all possible doubts about bias in estimates would focus, especially in the collection of data, on ways to diminish selection or simultaneity bias. Existing studies usually confronted these problems after data collection, then being forced to employ ad hoc methods. In contrast, it is with data collection that the most profitable route would begin. In the case of privatization and the effects of different owners, this would entail detailed, micro-institutional study of the process that generated private ownership. The hope would be that such study would uncover instrumental variables whose properties were so transparent that they left no concerns. In the case of competition or soft budgets, the research design would entail the construction of measures of competition or of budget hardness that were independent of enterprise performance. Again, detailed study of institutional processes would be highly beneficial, in leading the researcher to the types of data that have the desired exogeneity properties and in convincing the reader of this fact.

An examination of complementarities in policies provides a second area where new research might offer a significant possibility of modifying the conclusions reached above. In policy debates at the beginning of transition, there was great emphasis on complementarities. However, neither theory nor existing empirical studies provide a strong guidance on where such complementarities exist or how to model or measure them.49 Existing empirical work on complementarities relies mainly on testing the effects of simple interactions between policy variables, suggesting an ad hoc approach formulated after data collection. A more convincing

49 Angelucci et al (2001), Grosfeld and Tressel (2001), Earle and Estrin (1998), Perevalov et al. (2000), and Djankov and Hoekman (2000) all contain results on complementarities. However, the patterns in the results defy an easy summary.
analysis would focus on complementarities at the beginning of research, designing data collection on the basis of both theory and detailed country-specific study. Using a structural approach to the estimation of complementarities, rather than trying different ad hoc interaction effects, would provide a more convincing analysis and would offer the possibility of policy implications of profound importance.

This is an appropriate juncture to make a more prosaic suggestion on future research. As we have become painfully aware while writing this paper, the existing literature has a number of deficiencies in the presentation of results and in the amount of information offered to the reader. All too often, papers obscure the type of quantitative information on economic effects that we presented in Tables 1 and 6. Often, this information can only be extracted with great effort; indeed, in a significant number of papers, we could not deduce the pertinent magnitudes. However, the size of economic effects should arguably be the most significant results in papers that examine policy.50

Deficiencies in presentation of information become most significant when trying to compare or combine the results of papers on identical topics. For example, we would have been able to present more incisive conclusions in the previous sections, if authors of the surveyed papers had devoted more consideration to presenting results so that they could be accurately compared with the rest of the literature. In this respect, it seems that economics lags some other empirical fields (Hunt 1997).

50 Other information is also frequently omitted. For example, the methodological appendix discusses how comparisons between different owners are made difficult because papers omit crucial statistical information.
8(b) The Elusive Determinant: Institutions

The beginning of transition coincided with the publication of North's (1990) influential book, with its central message that institutions were crucial to the success of market capitalism. This message was not at the forefront of policy discussions during the early years of transition. Gradually the focus has changed, spurred by a recognition that the relatively poor performance of the CIS was not explained by differences in standard reforms. Institutions are now in vogue (Johnson, Kaufmann, and Shleifer, 1997, Blanchard and Kremer, 1997, Stiglitz, 1999). It is no coincidence that the same emphasis is now present in the more general literature on growth and development (Hall and Jones, 1999, Acemoglu, Johnson, and Robinson, 2001).

However, as Williamson (2000, p. 595) states "we are still very ignorant about institutions”. This is no more so than when relying on the evidence that is the focus here, the determinants of large-enterprise restructuring in transition. There is a dearth of studies including institutional variables. One reason for this is that research has followed policy, focusing on privatization, competition, and soft-budgets. A second is that the institutional framework is often the same for all enterprises, leading to difficulties in designing tests. This has led to the use of indirect estimates to judge institutional effects.

One indirect approach uses variations across enterprises in the need for institutions. This has been employed to examine Blanchard and Kremer's (1997) theory that the erosion of contract enforcement mechanisms was a primary factor causing the large output fall in the CIS. They hypothesize that the need for contract enforcement is more critical for enterprises with more complex input requirements. Such enterprises would perform relatively worse in the period after

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51 For a fuller history of the ebb and flow of policies in the first decade of transition, see Clement and Murrell (2001). The essays in Clague and Rausser (1992) constitute an exception to the early lack of focus on institutions.
the abandonment of contract enforcement through planning but before the creation of any effective alternative. This prediction also follows from the observation that the supply of information and the coordination of decisions was a central task of the now defunct planning apparatus (Murrell, 1992).

Tests of this prediction relate measures of the complexity of enterprise relationships to economic performance, with complexity capturing the institutional effect indirectly by proxying the need for institutions. Konings (1998) measures complexity by the number of firms in the enterprise's sector and Konings and Walsh (1999) use number of products produced by an enterprise, obtaining evidence that is generally supportive of the prediction in Bulgaria, Estonia, and Ukraine. Recanatini and Ryterman (2000) use the measure suggested by Blanchard and Kremer (1997), the diversity of sources of inputs, with negative results. However, they do find that growth was lower in those enterprises that formerly received the strongest institutional support from central planning, one interpretation being that this variable is a proxy for some institutional need.

Johnson, McMillan and Woodruff (2002) also examine contract enforcement, using a different, indirect approach. They exploit differences in managerial beliefs about the effectiveness of institutions, finding that managers who believe that courts can enforce contracts extend more trade credit than those who do not. These results suggest that effective courts can significantly enhance economic efficiency. In a similar study, Frye (2001) finds that the variations in the quality of police services, as measured in opinions, are important determinants of investment. Hendley, Murrell, and Ryterman (2001) use the amount of legal human capital in an enterprise to assess the effects of law on Russian enterprises. They find that such capital is an important determinant of success in transactions, concluding that legal institutions affect
enterprise performance even in supposedly lawless Russia. Although their measure of human capital is based on facts rather than opinions, the conclusion that institutions affect performance is still only an indirect implication.

Corporate governance is another important element of the institutional infrastructure pertinent for large enterprises. But the evidence on this too is sparse and indirect. Using largely anecdotal evidence, Black, Kraakman, and Tarassova (2000) and Fox and Heller (2000) for Russia, and Stiglitz (1999) more generally, claim that the failure of corporate governance institutions has been of great importance. Anderson, Korsun, and Murrell (1999) do use systematic survey data to show that corporate governance laws work poorly in Mongolia, but they present no evidence on whether there is a cost in terms of foregone restructuring.

Black (2001) focuses on corporate governance practices in Russia enterprises. He estimates that a 600-fold increase in stock-market valuation would follow from implementing best-practice, rather than worst-practice, corporate governance. Although the differences in practices are not due to different institutions and although valuation is not the same as efficiency, these estimates are suggestive of the improvements that might be stimulated by more effective institutions.

Our analysis in Section 4 also offers indirect evidence on the importance of corporate governance institutions. The owners most dependent on institutional support are diffuse individual owners, outsiders where there are a number of different blockholders, and perhaps even workers. Hence, the pattern of ownership effects in Figure 2 is broadly consistent with the argument that corporate governance institutions functioned less well in the CIS than elsewhere (Coffee, 1999). This interpretation is reinforced when one examines the amount of variation of ownership effects in the two regions. There is much more variation in ownership effects in the
CIS, suggesting that institutions have been more effective in Eastern Europe in providing the support that is essential to some types of owners but not needed by others.\textsuperscript{52}

Competition policy was a strong focus of early institutional reforms (Joskow, Schmalensee, and Tsukanova, 1994). Our results in Section 5 certainly show that competition is important, but existing research does not allow one to take the extra step to conclude that competition policy itself was a critical factor. Dutz and Vagliasindi (2000) aggregate data on individual firms to the country level and show that competition policy led to an increase in enterprise mobility. Brown and Earle (2001) show that competition-enhancing policies, such as price decontrol and infrastructure investment, can increase the effect of competition on enterprise productivity in Russia. Again missing from this area of study is research that directly estimates the link between institutions and restructuring at the level of the enterprise.

This literature survey provides ample testimony to the fact that the evidence on the connection between institutions and enterprise restructuring is both scant and indirect.\textsuperscript{53} Evidently, if institutions are to deserve the prominence in policy deliberations on enterprise restructuring that they presently have, empirical work at the enterprise level is a matter of great urgency.

\textit{8c. Transition as Development}

Over the last decade, the empirical research on enterprise restructuring in transition has developed as a separate field, with only sporadic cross-pollination with the more general literature on economic efficiency, growth, and development. Two factors explain this somewhat

\textsuperscript{52} Grigorian (2000) suggests an interesting institutional reason for the different results for banks in the CIS and Eastern Europe. Commercial banks in several Eastern European countries were reluctant to take large equity positions in privatized enterprises, in order to make their prudential practices consistent with those in the European Union. This led to less ability to impose restructuring.

\textsuperscript{53} We should emphasize that we are restricting discussion to the focus of this paper, empirical work explaining restructuring in large enterprises.
isolated stance. First, the research on transition partially emerged from the older comparative economics literature, which focused most of all on comparisons of socialism and capitalism. With the collapse of socialism and with capitalism constituting the only viable target, the subsequent rapid transformation in the former socialist economies led to a one-dimensional focus on the path from plan to market, in analyzing policy and in the associated changes at the enterprise level. Second, the very specific characteristics of socialist enterprises caused researchers to view restructuring in transition as a singular task, rather separate from the issues of attaining corporate efficiency in market-capitalist economies. In section 2 we described a prototypical socialist enterprise and the many dimensions of the enormous changes that it faced in the 1990s. Many of these changes, e.g., selling shares for vouchers or the first contacts with foreign businesses, were unparalleled in other economies, both in character and in size.

Since the start of transition, the former socialist countries have developed capitalist economies, albeit functioning quite differently from each other and differently from capitalist economies that traversed other historical paths. There is the odd country still clinging to a socialist-type economy, e.g., Belarus, Uzbekistan, but even in such places there is privatization, entry of new private firms, import competition, and the establishment of some institutions characteristic of capitalism. With the most basic features of capitalism now established, the policy issues that China, Eastern Europe, and the CIS now encounter in their restructuring efforts are common-place across the world's economies. For example, governments face the task of producing more effective corporate governance institutions and the need to resist the political pressures from industrial dinosaurs, while enterprises confront the challenges of entering new markets and shaping corporate structures to attract finance. In short, the process of transition and the research on restructuring in transition have both matured to a point where future research
efforts can integrate easily into a broader literature that studies differences between capitalist economies and between varieties of those institutions that support a vibrant corporate sector.

Such integration would greatly enrich the study of enterprise restructuring in transition, as it would bring to bear the findings of a voluminous literature on growth and development in capitalist economies. For example, this wider literature recognizes the fact that different capitalist economies evidence many different ways of solving the institutional problem of promoting enterprise efficiency. But the institutional solutions are not always, nor perhaps often, the result of direct efforts to improve efficiency. Rather, they are the product of the efforts of powerful interest groups that aim to enrich themselves. Hence, it is incorrect to consider a country’s policy reforms and new institutions as efficient adaptations to a country’s environment (Djankov et al. 2002b), as is quite often implicitly assumed in the literature that we have reviewed. For example, the difference between the effects of privatization and increased competition in Eastern Europe and the CIS, documented in this paper, would be profitably studied from the perspective of the political economy of the creation of institutions.

Scholars outside the field of transition will also benefit from the integration of research on restructuring in transition into the more general study of institutions and economic development. As evidenced in this paper, the transition experience provides multiple case studies of reform, exhibiting great successes and spectacular failures. Scholars of policy reform have much to learn from the study of the former socialist economies. The distinctive history of the transition economies, which still affects present structures, provides the extra exogenous variation in independent variables that is so important in the generation of incisive empirical results. But this variation is only useful if it is one of degree rather than kind, meaning that lessons can be drawn
from country comparisons. Now with transition and transition research into its second decade, we conclude that this is the case.

9. Concluding Comments

We have surveyed the research on enterprise restructuring in transition to synthesize its main findings and to convey the evolving structure of this field of study. We find plentiful work examining the effects on restructuring of privatization, different types of new owners, competition, hardened budget constraints, and policies on managers. Using a methodology that enables us to combine the many results on each of these determinants, we analyze the effects of each separately, contrast the size of the various effects in Eastern Europe and in the CIS, and compare the results on different determinants to each other.

A capsule summary of the results appears in the Introduction and no reiteration is needed here. But we do leave the reader with one last perspective, in Figure 3. The figure pulls together the comparable quantitative evidence on the effects of the main policy reforms pursued by transition economies in their efforts to restructure the enterprise sector. Although it is a somewhat hazardous exercise to compare partial correlation coefficients reflecting the effects of such disparate policies, such comparisons constitute the only concrete evidence that is available to judge which policies are most effective. In our view, this figure aptly summarizes the findings of the preceding sections.54

[Figure 3 here]

Privatization to outsiders is found to have the largest positive effects on enterprise restructuring, both in Eastern Europe and in the CIS. Hardened budgets are also economically significant in explaining restructuring. Increased competition is associated with positive results

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54 Indeed, it is based on the partial correlation coefficients reported in Figure 2, Tables 7B and 8B.
in Eastern Europe but not in the CIS. In fact, in the initial transition period, import competition is
detrimental to enterprise restructuring in Russia, Ukraine, Kazakhstan, and the other CIS
countries. Finally, privatization to workers has not enhanced restructuring in Eastern Europe and
has had negative effects in the CIS.

In Section 8, we suggested directions for future research. Large rewards await the researchers
who venture into those areas, especially those who are able to isolate the effects of institutions on
enterprise restructuring, and who do so in a manner facilitating precise comparisons between the
effects of institutional creation or reform and the effects of the policies examined above.
References


Djankov, Simeon, Rafael La Porta, Florencio Lopez-de-Silanes, and Andrei Shleifer, "The New Comparative Economics," Department of Economics, Harvard University, Feb 2002b.


Table 1: The Gains or Losses Due to Ownership Change: A Sampling of Estimates

Estimates of the performance of a 100% private firm relative to a 100% state firm. Positive signs indicate superior private performance. For the growth measures, relative performance is private firm yearly growth rate minus state firm yearly growth rate. For the levels measures, relative performance is private firm productivity minus state firm productivity expressed as a % of state productivity.

<table>
<thead>
<tr>
<th>Output or Sales Growth</th>
<th>Productivity Growth</th>
<th>Levels of Productivity</th>
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</thead>
<tbody>
<tr>
<td>% Private minus % State</td>
<td>Country</td>
<td>% Private minus % State</td>
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<tr>
<td></td>
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<tr>
<td>8.7</td>
<td>Poland¹</td>
<td>4.3</td>
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<tr>
<td>7.3</td>
<td>Central Europe²</td>
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<td>-9.7</td>
<td>Russia³</td>
<td>10.6</td>
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<tr>
<td>10.9</td>
<td>Bulgaria⁴</td>
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<tr>
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<td>0.9</td>
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<td>Kyrgyz⁶</td>
<td>3.1</td>
</tr>
</tbody>
</table>

Notes: These estimates are based on the authors’ calculations, derived from information presented in the following papers: ¹ Grosfeld and Nivet (1999); ² Frydman et al. (1999); ³ Jones (1998); ⁴ Pohl, Anderson, Claessens, and Djankov (1997); ⁵ Perevalov et al. (2001); ⁶ Roberts, Gorkov, and Madigan (1999); ⁷ Djankov (1999a); ⁸ Earle and Telgedy (2001); ⁹ Carlin et al. (2001); ¹⁰ Claessens and Djankov (2000); ¹¹ Brown and Earle (2000); ¹² Earle (1998); ¹³ Jones and Mygind (1999); ¹⁴ Jones and Mygind (2000); ¹⁵ Anderson et al. (2000b); ¹⁶ Smith et al. (1997).
<table>
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<th>Paper</th>
<th>Countries</th>
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<th>Levels or growth</th>
<th>Privatization measure</th>
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<td>softness of budgets</td>
<td>% ownership</td>
<td>% ownership</td>
</tr>
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<td>% ownership</td>
<td>% ownership</td>
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<td>Brown and Earle (2000)</td>
<td>Russia</td>
<td>TFP</td>
<td>% ownership</td>
<td>% ownership</td>
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<tr>
<td>Brown and Brown (1999)</td>
<td>Russia</td>
<td>sectoral profitability</td>
<td>% of sectoral output in private firms</td>
<td>% ownership</td>
</tr>
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<td>productivity, creation of new products</td>
<td>growth, levels</td>
<td>dummy if privatized</td>
</tr>
<tr>
<td>Claessens and Djankov (2000)</td>
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<td>TFP, labor productivity</td>
<td>growth</td>
<td>dummy if 33% private</td>
</tr>
<tr>
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<td>sales, renovations</td>
<td>growth</td>
<td>% ownership</td>
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<tr>
<td>Djankov (1999c)</td>
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<td>Earle and Rose (1997)</td>
<td>Russia</td>
<td>production of new goods</td>
<td>levels</td>
<td>dummy if privatized</td>
</tr>
<tr>
<td>Earle and Sabirainova (1999)</td>
<td>Russia</td>
<td>wage arrears</td>
<td>levels</td>
<td>dummy if privatized</td>
</tr>
<tr>
<td>Earle, Estrin, and Leshchenko (1996)</td>
<td>Russia</td>
<td>links to government, sales</td>
<td>levels</td>
<td>dummy if privatized</td>
</tr>
<tr>
<td>Earle and Telgedy (2001)</td>
<td>Romania</td>
<td>TFP</td>
<td>levels</td>
<td>% ownership</td>
</tr>
<tr>
<td>Estrin and Rosevear (1999a)</td>
<td>Ukraine</td>
<td>profits, sales</td>
<td>levels</td>
<td>dummy if privatized</td>
</tr>
<tr>
<td>Estrin and Rosevear (1999b)</td>
<td>Ukraine</td>
<td>qualitative restructuring</td>
<td>levels</td>
<td>dummy if privatized</td>
</tr>
<tr>
<td>Evans-Klock and Samorodov (1998)</td>
<td>Kyrgyz</td>
<td>excess employment</td>
<td>levels</td>
<td>dummy if privatized</td>
</tr>
<tr>
<td>Frydman, Gray, Hessel, and Rapaczynski (1999)</td>
<td>Hungary, Poland, Czech Republic</td>
<td>revenues, labor productivity growth</td>
<td>dummy if privatized</td>
<td></td>
</tr>
<tr>
<td>Frydman, Gray, Hessel, and Rapaczynski (2000)</td>
<td>Hungary, Poland, Czech Republic</td>
<td>default on debts</td>
<td>levels</td>
<td>dummy if 33% private</td>
</tr>
<tr>
<td>Glennerster (2000)</td>
<td>Macedonia</td>
<td>profits per worker</td>
<td>growth</td>
<td>dummy if privatized</td>
</tr>
<tr>
<td>Grigorian (2000)</td>
<td>Lithuania</td>
<td>TFP, labor productivity</td>
<td>levels</td>
<td>% ownership</td>
</tr>
<tr>
<td>Grosfeld and Nivet (1999)</td>
<td>Poland</td>
<td>output</td>
<td>growth</td>
<td>dummy if privatized</td>
</tr>
<tr>
<td>Hendley, Murrell, and Ryterman (2001)</td>
<td>Russia</td>
<td>success in transactions</td>
<td>levels</td>
<td>% ownership</td>
</tr>
<tr>
<td>Jones (1998)</td>
<td>Russia</td>
<td>revenues, labor productivity growth</td>
<td>dummy if 50% private</td>
<td></td>
</tr>
<tr>
<td>Jones and Mygind (1999)</td>
<td>Estonia</td>
<td>TFP</td>
<td>levels</td>
<td>dummy if 50% private</td>
</tr>
<tr>
<td>Konings (1997)</td>
<td>Hungary, Romania Slovenia</td>
<td>revenues</td>
<td>levels</td>
<td>% ownership</td>
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<tr>
<td>Lehmann, Wadsworth, and Acquisti (1999)</td>
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<td>levels</td>
<td>% ownership</td>
</tr>
<tr>
<td>Linz and Krueger (1998)</td>
<td>Russia</td>
<td>labor productivity</td>
<td>growth</td>
<td>dummy if privatized</td>
</tr>
<tr>
<td>Major (1999)</td>
<td>Hungary</td>
<td>capital productivity</td>
<td>levels</td>
<td>ownership scale</td>
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<tr>
<td>Perevalov, Gimadi, and Dobrodey (2000)</td>
<td>Russia</td>
<td>revenues, labor productivity growth, levels</td>
<td>dummy if privatized</td>
<td></td>
</tr>
<tr>
<td>Pohl, Anderson, Claessens, and Djankov (1997)</td>
<td>Bulgaria, Czech Republic, Hungary, Poland, Romania, Slovenia, Slovakia</td>
<td>TFP</td>
<td>growth</td>
<td>dummy if privatized</td>
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<tr>
<td>Roberts, Gorkov, and Madigan (1999)</td>
<td>Kyrgyz Republic</td>
<td>sales, labor productivity, qualitative restructuring</td>
<td>growth, levels</td>
<td>dummy if privatized</td>
</tr>
<tr>
<td>Smith, Cin, and Vodopivec (1998)</td>
<td>Slovenia</td>
<td>TFP</td>
<td>levels</td>
<td>% ownership</td>
</tr>
<tr>
<td>Warzynski (2001b)</td>
<td>Ukraine</td>
<td>productivity</td>
<td>growth</td>
<td>dummy if privatized</td>
</tr>
<tr>
<td>Xu and Wang (1999)</td>
<td>China</td>
<td>return on equity and assets restructuring index</td>
<td>levels</td>
<td>dummy if privatized</td>
</tr>
<tr>
<td>Zemplinerova, Lastovicka, and Marcincin (1995)</td>
<td>Czech Republic</td>
<td>TFP</td>
<td>levels</td>
<td>% ownership</td>
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Table 2: Studies of Privatization
Table 3: The Effects of Private versus State Ownership on Enterprise Restructuring
Composite statistics derived from 93 analyses appearing in 37 studies

<table>
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<tr>
<th>Regions</th>
<th>Type of dependent variable in the analyses</th>
<th>Number of analyses contributing to the composite test statistic</th>
<th>Weighting method used</th>
<th>Overall rating of quality</th>
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<td>(3)</td>
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<td>13.34</td>
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<td>15.49</td>
</tr>
<tr>
<td>CIS</td>
<td>Both</td>
<td>53</td>
<td>3.95</td>
<td>2.84</td>
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<tr>
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<td>11.78</td>
<td>11.07</td>
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<tr>
<td>EE</td>
<td>Quantitative</td>
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<td>15.14</td>
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<td>0.37</td>
<td>-2.28</td>
</tr>
<tr>
<td>All countries</td>
<td>Qualitative</td>
<td>29</td>
<td>6.64</td>
<td>7.58</td>
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<td>Qualitative</td>
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<td>3.71</td>
<td>3.71</td>
</tr>
<tr>
<td>CIS</td>
<td>Qualitative</td>
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<td>5.35</td>
<td>6.76</td>
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Table 4: Comparing the Size of Privatization Effects across Regions
Partial correlation coefficients and test statistics derived from 90 analyses from 36 studies

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<th>Weighting method used</th>
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<th>(3)</th>
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<td></td>
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<td>Overall rating of quality</td>
<td></td>
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<tr>
<td>EE</td>
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<td>0.073</td>
<td>0.075</td>
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<tr>
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<td>Both</td>
<td>53</td>
<td>0.038</td>
<td>0.041</td>
<td>0.016</td>
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<td>Test for differences</td>
<td>Both</td>
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<td>3.89</td>
<td>2.74</td>
<td>4.82</td>
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<tr>
<td>EE</td>
<td>Quantitative</td>
<td>34</td>
<td>0.078</td>
<td>0.070</td>
<td>0.073</td>
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<td>Quantitative</td>
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<td>0.016</td>
<td>-0.001</td>
<td>-0.019</td>
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</tr>
<tr>
<td>Test for differences</td>
<td>Quantitative</td>
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<td>4.14</td>
<td>4.63</td>
<td>5.41</td>
<td></td>
</tr>
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<td>EE</td>
<td>Qualitative</td>
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<td>0.146</td>
<td>0.145</td>
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<td>Qualitative</td>
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<td>0.089</td>
<td>0.064</td>
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</tr>
<tr>
<td>Test for differences</td>
<td>Qualitative</td>
<td></td>
<td>1.99</td>
<td>1.36</td>
<td>1.84</td>
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Normally distributed statistics
Table 5: Testing Differences between the Effects of a Variety of Owners
Statistics derived from 341 pairwise comparisons of owners taken from 24 studies

<table>
<thead>
<tr>
<th>Workers</th>
<th>Traditional State</th>
<th>Diffuse Individual</th>
<th>Managers</th>
<th>Insiders</th>
<th>Outsiders</th>
<th>Commercialized State</th>
<th>Banks</th>
<th>Foreign</th>
<th>Blockholders</th>
</tr>
</thead>
<tbody>
<tr>
<td>Traditional State</td>
<td>1.36</td>
<td>1.78</td>
<td></td>
<td></td>
<td></td>
<td></td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Diffuse Individual</td>
<td>1.93</td>
<td>0.90</td>
<td>0.63</td>
<td></td>
<td></td>
<td></td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Insiders</td>
<td>2.77</td>
<td>2.61</td>
<td>3.12</td>
<td>0.45</td>
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<td></td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Outsiders</td>
<td>3.20</td>
<td>3.45</td>
<td>3.54</td>
<td>1.09</td>
<td>1.67</td>
<td></td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Commercialized State</td>
<td>4.12</td>
<td>5.69</td>
<td>7.21</td>
<td>1.99</td>
<td>5.28</td>
<td>2.28</td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Banks</td>
<td>3.53</td>
<td>3.42</td>
<td>3.04</td>
<td>1.93</td>
<td>2.09</td>
<td>1.39</td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Foreign</td>
<td>4.82</td>
<td>7.82</td>
<td>7.67</td>
<td>2.98</td>
<td>6.66</td>
<td>4.18</td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Blockholders</td>
<td>4.90</td>
<td>7.73</td>
<td>7.74</td>
<td>3.09</td>
<td>6.71</td>
<td>4.36</td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Investment Funds</td>
<td>5.55</td>
<td>7.05</td>
<td>5.98</td>
<td>4.28</td>
<td>5.30</td>
<td>4.60</td>
<td></td>
<td></td>
<td></td>
</tr>
</tbody>
</table>

Interpreting the table: To compare owners A and B: If the cell located at the intersection of A’s row and B’s column is blank, then B is more productive than A. If the cell corresponding to A’s column and B’s row is non-empty, then the number in that cell is the t-statistic for a test of the null hypothesis that B’s effect minus A’s effect is equal to zero.
Table 6: The Gains or Losses Due to Product Market Competition
(A sampling of estimates)

<table>
<thead>
<tr>
<th>Study</th>
<th>Country</th>
<th>Dependent Variable</th>
<th>Explanatory variable</th>
<th>Economic Effect ¹</th>
</tr>
</thead>
<tbody>
<tr>
<td>Angelucci et al, 2001</td>
<td>Romania</td>
<td>Log TFP level</td>
<td>Herfindahl level</td>
<td>19.1%</td>
</tr>
<tr>
<td>Perevalov et al, 2001</td>
<td>Russia</td>
<td>Log TFP level</td>
<td>Number of competitors</td>
<td>2.4%</td>
</tr>
<tr>
<td>Grosfeld and Tressel, 2001</td>
<td>Poland</td>
<td>TFP growth</td>
<td>Own market share</td>
<td>1.4 pp</td>
</tr>
<tr>
<td>Djankov and Hoekman, 2000</td>
<td>Bulgaria</td>
<td>TFP growth</td>
<td>Herfindahl level</td>
<td>1.4 pp</td>
</tr>
<tr>
<td>Warzynski 2001b</td>
<td>Ukraine</td>
<td>TFP growth</td>
<td>Number of competitors</td>
<td>-3.8 pp</td>
</tr>
<tr>
<td>Brown and Earle, 2000</td>
<td>Russia</td>
<td>Log TFP level</td>
<td>Herfindahl level</td>
<td>1.4%</td>
</tr>
<tr>
<td>Konings, 1998</td>
<td>Bulgaria</td>
<td>TFP growth</td>
<td>Herfindahl level</td>
<td>4.4 pp</td>
</tr>
<tr>
<td>Konings, 1998</td>
<td>Estonia</td>
<td>TFP growth</td>
<td>Herfindahl level</td>
<td>-1.0 pp</td>
</tr>
<tr>
<td>Halpern and Korosi, 1998</td>
<td>Hungary</td>
<td>Log TFP level</td>
<td>Herfindahl level</td>
<td>-2.6%</td>
</tr>
<tr>
<td>Anderson et al, 2000b</td>
<td>Mongolia</td>
<td>Log TFP level</td>
<td>own market share</td>
<td>9.2%</td>
</tr>
<tr>
<td>Claessens and Djankov, 2000</td>
<td>Hungary</td>
<td>Labor prod. growth</td>
<td>3-firm concentration</td>
<td>7.1 pp</td>
</tr>
<tr>
<td>Markov et al, 2000</td>
<td>Bulgaria</td>
<td>Log TFP level</td>
<td>Own market share</td>
<td>-23.7%</td>
</tr>
<tr>
<td>Markov et al, 2000</td>
<td>Bulgaria</td>
<td>Log TFP level</td>
<td>3-firm concentration</td>
<td>5.9%</td>
</tr>
<tr>
<td>Angelucci et al, 2001</td>
<td>Romania</td>
<td>Log TFP level</td>
<td>import penetration</td>
<td>-6.0%</td>
</tr>
<tr>
<td>Markov et al, 2000</td>
<td>Bulgaria</td>
<td>Log TFP level</td>
<td>import penetration</td>
<td>-2.1%</td>
</tr>
<tr>
<td>Brown and Earle, 2000</td>
<td>Russia</td>
<td>Log TFP level</td>
<td>import penetration</td>
<td>1.4%</td>
</tr>
<tr>
<td>Djankov and Hoekman, 2000</td>
<td>Bulgaria</td>
<td>TFP growth</td>
<td>import penetration</td>
<td>1.1 pp</td>
</tr>
<tr>
<td>Halpern and Korosi, 1998</td>
<td>Hungary</td>
<td>Log TFP level</td>
<td>import penetration</td>
<td>3.0%</td>
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<tr>
<td>Dobrinsky et al, 2001</td>
<td>Bulgaria</td>
<td>Log TFP level</td>
<td>import penetration</td>
<td>-0.7%</td>
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<td>Kreacic, 1998</td>
<td>Georgia</td>
<td>Log TFP level</td>
<td>import penetration</td>
<td>-5.8%</td>
</tr>
<tr>
<td>Claessens and Djankov, 2000</td>
<td>Czech Rep.</td>
<td>Labor prod. growth</td>
<td>tariff levels</td>
<td>4.3 pp</td>
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</table>

¹ The economic effect is calculated from the coefficient estimates assuming a 10 percentage points change in the explanatory variable. pp means percentage points.
Table 7: Import and Domestic Competition and Enterprise Restructuring  
Composite statistics derived from 82 analyses appearing in 23 studies

<table>
<thead>
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<th>Category</th>
<th>Number of analyses contributing to the composite test statistic</th>
<th>Weighting method used</th>
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<tr>
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A. Composite Normally Distributed Statistics

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<th>Number of analyses contributing to the composite test statistic</th>
<th>Weighting method used</th>
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<tr>
<td>Domestic competition</td>
<td>54</td>
<td>4.27</td>
</tr>
<tr>
<td>EE, all competition</td>
<td>58</td>
<td>5.09</td>
</tr>
<tr>
<td>CIS, all competition</td>
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<td>1.58</td>
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<td>EE, import competition</td>
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<td>3.97</td>
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B. Partial Correlation Coefficients and Test Statistics on Their Significance

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<td>0.032</td>
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<td>EE, domestic competition</td>
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<td>0.030</td>
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Table 8: Hard Budget Constraints and Enterprise Restructuring
Composite statistics derived from 31 analyses appearing in 11 studies

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</tr>
<tr>
<td></td>
<td></td>
<td>Attempts to handle simultaneity bias</td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td></td>
<td></td>
<td>Overall rating of quality</td>
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A. Testing the Effects of Hardening Budgets

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<th>(3)</th>
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<td></td>
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<td>Attempts to handle simultaneity bias</td>
<td></td>
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<td></td>
<td></td>
<td>Overall rating of quality</td>
<td></td>
<td></td>
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</table>

Composite normally distributed statistics

<table>
<thead>
<tr>
<th>Region</th>
<th></th>
<th>Partial correlation coefficients and test statistics on their significance</th>
</tr>
</thead>
<tbody>
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</table>

B. Comparing Effects between Regions

<table>
<thead>
<tr>
<th>Region</th>
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<th>Partial correlation coefficients and test statistics on their significance</th>
</tr>
</thead>
<tbody>
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<td></td>
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</tbody>
</table>

All countries 31 8.44 6.81 7.63
EE 23 7.34 6.52 7.78
CIS 8 4.17 2.26 2.13

EE 23 0.027 0.025 0.029
CIS 8 0.065 0.045 0.045
Test of difference -1.53 -0.64 -0.50
Table 9: The Role of Managers in Enterprise Restructuring
Composite statistics derived from 33 analyses appearing in 12 studies

<table>
<thead>
<tr>
<th>Region</th>
<th>Number of analyses contributing to the composite test statistic</th>
<th>Weighting method used</th>
<th>(1)</th>
<th>(2)</th>
<th>(3)</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td></td>
<td></td>
<td>None</td>
<td>Attempts to handle simultaneity bias</td>
<td>Overall rating of quality</td>
</tr>
<tr>
<td>A. Do Managers Matter?</td>
<td></td>
<td></td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Both turnover and incentives</td>
<td>33</td>
<td>8.19</td>
<td>9.18</td>
<td>9.46</td>
<td></td>
</tr>
<tr>
<td>Management turnover</td>
<td>13</td>
<td>7.63</td>
<td>7.55</td>
<td>8.34</td>
<td></td>
</tr>
<tr>
<td>Management incentives</td>
<td>20</td>
<td>4.38</td>
<td>5.67</td>
<td>5.40</td>
<td></td>
</tr>
<tr>
<td>B. Comparison of Significance</td>
<td></td>
<td>Partial correlation coefficients and test statistics on their significance</td>
<td></td>
<td></td>
<td></td>
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<tr>
<td>Management turnover</td>
<td>13</td>
<td>0.034</td>
<td>0.032</td>
<td>0.038</td>
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<tr>
<td>Management incentives</td>
<td>20</td>
<td>0.039</td>
<td>0.047</td>
<td>0.040</td>
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<tr>
<td>Test of difference</td>
<td></td>
<td>-0.39</td>
<td>-1.01</td>
<td>-0.21</td>
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</tbody>
</table>
Figure 1: How Ownership Affects Firm Performance after Privatization
Estimated Effects of Changing from Traditional State Ownership to Different Private Owners
Figure 2: Regional Variations in the Effects of Different Types of Owners
Comparing Ownership Effects in Eastern Europe to those in the CIS
Figure 3: How Policy Reform Affects Enterprise Performance
Comparing Effects in Eastern Europe to those in the CIS

Partial Correlation Coefficients

Policy Reform

EE
CIS

-0.10
-0.08
-0.06
-0.04
-0.02
0.00
0.02
0.04
0.06
0.08
0.10

-0.10
-0.08
-0.06
-0.04
-0.02
0.00
0.02
0.04
0.06
0.08
0.10

-0.10
-0.08
-0.06
-0.04
-0.02
0.00
0.02
0.04
0.06
0.08
0.10

-0.053
0.000
0.094
0.087
0.024
0.029
0.025
0.045
-0.002
-0.087
-0.08
Methodological Appendix

This appendix develops the methods introduced in sections 3(b) and 4 and employed in Sections 3-7. This appendix should be read in conjunction with Sections 3 and 4.

(a). Comparing sets of studies

For expositional purposes, begin with the simplest linear model:

\[ Y = \alpha + \gamma P + \varepsilon \]  

(A.1)

where all variables and parameters are as defined as in equation (1) of the text. Variances of the pertinent variables (and their estimates) are denoted by \( \sigma_Y^2, \sigma_P^2, \) and \( \sigma_\varepsilon^2 \), where \( \sigma_\varepsilon^2 = \gamma^2 \sigma_P^2 + \sigma_\varepsilon^2 \). The t-statistic corresponding to the \( k^{th} \) study's \( \hat{\gamma} \) for equation (A.1) is then:

\[ t_k = \hat{\gamma}_k \left( n_k \right)^{1/2} \frac{\sigma_{pk}}{\sigma_{ek}} \]  

(A.2)

where \( n_k \) is degrees of freedom in the \( k^{th} \) study. We assume that sample size is large relative to the number of parameters estimated, so that it approximates degrees of freedom. This is a pragmatic assumption, since many studies do not indicate precisely how many parameters are estimated, leaving degrees of freedom unknown.\(^1\)

On inspection of equation (A.2), it is apparent that the presence of sample size in the t-statistic renders it inappropriate for cross-study comparisons of economic size of effects (of ownership, competition, etc.). But (A.2) shows that t-statistics have an important property: they are invariant to changes in units of Y or P. When comparing estimates across a heterogeneous collection of studies, we seek a statistic that does not reflect sample size but is invariant to units.

The standard procedure in the meta-evaluation literature is to use a statistic that is intermediate between the t-statistic and \( \hat{\gamma} \) (Rosenthal, 1984). This is the correlation coefficient, which is scale free and does not depend on sample size:

\[ r_k = \hat{\gamma}_k \left( n_k \right)^{1/2} \frac{\sigma_{pk}}{\sigma_{Yk}} \]  

\[ r_k = \hat{\gamma}_k \left( n_k \right)^{1/2} \frac{\sigma_{pk}}{\sqrt{\sigma_{Yk}^2 + \sigma_{ek}^2}} \]  

(A.3)

It is now simple to make an analogy to the case in which other variables (X) are present. We simply use partial correlation coefficients, where the \( \sigma_{Yk} \) and \( \sigma_{pk} \) that appear in equation (A.3) are now the standard deviations of the errors in a regression of X on Y and the standard deviation of the errors in a regression of X on P. Loosely speaking, the variables that are correlated are those that capture variations in P and Y after P and Y have been purged of any variations due to X: P and Y controlling for X. There is a similar adaptation in the t-statistic: equation (A.2) should also use the standard deviations of P and Y controlling for X. Since partial correlation coefficients are usually not published, it is fortunate that (A2) and (A.3) imply that there is a simple relation between t-statistics and the corresponding correlations:

\[ r_k^2 = t_k^2 \left( 1 + \frac{n_k}{t_k^2} \right) \]  

(A.4)

---

\(^1\) For example, studies often include industry dummies without stating the number of sectors.
where the formula applies equally to partial correlations (Greene 2000).2

When testing correlation coefficients, it is usual to use a transformation, “Fisher's Zr” \((\ln[(1+r)/(1-r)]/2)\), which is approximately normally distributed. Its variance is \([1/(n-3)]\), where \(n\) is the sample size used to calculate the correlation coefficient (Shadish and Haddock, 1994). Tests on the means of a set of correlations involve transforming each correlation and using the means of the transformations, also normally distributed. Moreover, weighting procedures can be employed to find weighted-mean partial correlations and to conduct tests on the weighted means of the Fisher's Zr transformations, so that one can investigate, just as in Table 3, how sensitive are the results to such factors as study-quality.

(b) Combining the Results of Studies on the Effects of Different Types of Owners

Two new problems arise when combining the results of studies using (4), instead of (1). First, important information is missing. Second, bilateral comparisons of ownership effects must be combined to produce a multilateral comparison. We address each problem in turn.

b.1 Missing information on the variance of ownership effects

Here, there is no loss in generality in examining a case where the typical study estimates:

\[
Y = \alpha + X\beta + \delta O + \theta I + \epsilon \\
\text{(A.5)}
\]

\(O\) and \(I\) are the amounts of ownership held by two different owners, e.g. insiders and outsiders. (The generalization to more owners appears below.) Whatever is not owned by these two is owned by a third entity, the state, the omitted ownership share. \(\delta\) and \(\theta\) are the parameters of interest and all other variables are as defined before. For estimates of (A.5) to be usable in the present context, it is necessary that \(O\) and \(I\) be measured on the same scale within a single study (but not necessarily across studies), so that \(\delta\) and \(\theta\) are comparable.

In papers estimating (A.5), the information of prime interest is the comparison of \(\hat{\delta}\) to \(0\) (outsiders versus insiders) and each of these to \(0\) (insiders or outsiders versus the state). Papers present the information to make the latter comparison, in the usual listing of coefficients and t-statistics, which can be converted into partial correlation coefficients showing the effect of changing ownership from state to outsider or state to insider. But obtaining all information pertinent to the comparison of \(\hat{\delta}\) and \(0\) presents some difficulties.

We require a t-statistic for a test of the null hypothesis that \(\delta = 0\). This statistic is a function of \(\hat{\delta}\) and \(\hat{\theta}\) and estimates of the variances of \(\hat{\delta}\) and \(\hat{\theta}\), all of which usually appear in papers, plus an estimate of the covariance of \(\hat{\delta}\) and \(\hat{\theta}\), which is invariably omitted, since:

\[
\text{Variance}(\hat{\delta} - \hat{\theta}) = \text{Variance}(\hat{\delta}) + \text{Variance}(\hat{\theta}) - 2\text{Covariance}(\hat{\delta}, \hat{\theta}) \\
\text{(A.6)}
\]

We sought a pragmatic method of estimating the variance of \((\hat{\delta} - \hat{\theta})\). \(O\) and \(I\) will almost always be negatively correlated because they are shares of ownership. Hence, the covariance of the estimates of the

---

2. The sign of the \(r_k\) is obtained from the sign of the estimated \(\gamma\).
parameters attached to O and I will almost certainly be positive. Therefore assuming the covariance equals zero will lead to an overestimate of the variance of $(\hat{\delta} - \hat{\theta})$.

We have verified this point in three ways. First, take a simple theoretical case. Assume that outsiders have 100% ownership in $\frac{1}{4}$ of enterprises, insiders 100% of another $\frac{1}{4}$, and the state completely owns the last $\frac{1}{4}$. Then, the covariance of $\hat{\delta}$ and $\hat{\theta}$ is equal to one-half of the variance of either $\hat{\delta}$ or $\hat{\theta}$. Second, we have used simulated ownership data with five ownership types and have consistently found in these simulations that the estimated covariance of $\hat{\delta}$ and $\hat{\theta}$ is positive and at least half the size of the smaller of the variances of the two estimated parameters. Third, we have investigated the size of the variance of $(\hat{\delta} - \hat{\theta})$ in two data sets, those used in Anderson, Lee, and Murrell (2000) and Claessens and Djankov (1999b). For those data sets (with various configurations of X's and ownership types), we found that the standard error of $(\hat{\delta} - \hat{\theta})$ varied between 75% and 122% of the standard errors of the $\hat{\delta}$'s and the $\hat{\theta}$'s.

Hence, the variance of $(\hat{\delta} - \hat{\theta})$ will almost certainly lie in the interval between the sum of the variances of $\hat{\delta}$ and $\hat{\theta}$ and the mean of the variances of $\hat{\delta}$ and $\hat{\theta}$. This suggests that we can take the t-statistics of $\hat{\delta}$ and $\hat{\theta}$, calculate the corresponding standard errors (S.E.’s) or variances (var.’s), and then form a crude estimate of the S.E. of $(\hat{\delta} - \hat{\theta})$:

$$\text{S.E.} (\hat{\delta} - \hat{\theta}) = \max \left\{ 1.25 \sqrt{\text{Var.}(\hat{\delta}) + \text{Var.}(\hat{\theta})} / 2, \max \left( \text{S.E.}(\hat{\delta}), \text{S.E.}(\hat{\theta}) \right) \right\}$$  \hspace{2cm} (A.7)

If the first term within the braces on the right-hand side of (A.7) applies, the estimated variance will lie between the mean estimated variance of the individual parameters and the sum of the estimated variances of the individual parameters. The 1.25 factor is a conservative adjustment, corresponding to the assumption that the covariance will usually be somewhat less than $\frac{1}{2}$ of the mean of the two variances. (Alternatively, if the covariance were zero, which is unlikely, this factor would need to be 1.41 [= $2^{\frac{1}{2}}$].) The second term within the braces is again a conservative adjustment, used when the variances of $\hat{\delta}$ and $\hat{\theta}$ are of quite different sizes (which is the case in only 25% of the analyses used in this paper). That element of (10) ensures that a very small variance does not influence the results too heavily.

Obviously, the procedure that we apply is not first best, but first best is not possible given the available information. Without a pragmatic second-best procedure it would not be possible to exploit the vast amount of information in the literature on the effects of different types of owners. In formulating (A.7), we have used conservative assumptions, to ensure that we do not over-estimate differences between owners. However, below, we do test whether these assumptions are too conservative.

b.2 Combining many bilateral ownership comparisons

The present sub-section examines how to aggregate information on the effects of different types of owners taken from many studies. Since each study usually contains several types of owners, each

---

3. Note that the comparisons between the relative sizes of variances and covariances does not depend on either the size of errors or the data on Y. As in the theoretical result, we assume that the equation does not contain X.
contributes several different pair-wise comparisons of owners (i.e., observations). The central variables of interest in each observation are the t-statistics and sample sizes, the latter denoted $n_{ijk}$. The t-statistics are obtained either directly from the studies or by using formula (A.7). Application of (A.4) gives partial correlation coefficients, $r_{ijk}$, where $i, j = 1, \ldots, 11$ (the number of categories of owners) and $k = 1, \ldots, K_{ij}$, with $K_{ij}$ the number of studies that contribute information on the $i,j$-th ownership comparison. $r_{ijk}$ estimates the effect of privatizing to ownership type $j$ rather than to ownership type $i$.

For some comparisons, e.g. insiders versus managers, $K_{ij}$ is zero because studies using enterprise data invariably make the sensible methodological decision not to use overlapping ownership categories within a single regression. For many other ownership comparisons, $K_{ij}$ is quite small, since data on many types of owners (e.g. banks, funds, etc) are not available for many countries. Therefore applying the methods of the previous section in a straightforward manner does not get us very far. We seek a method that combines information from all data points when obtaining estimates of the effect of each type of owner.4 This is accomplished using a dummy-variable regression framework:

$$r_{ijk} = \sum_{m=1}^{11} \lambda_m D_{ijk}^m + \epsilon_{ijk}$$  \hspace{1cm} (A.8)

As we have information on only the relative performance of owners, it is not possible to estimate all 11 partial correlation coefficients ($\lambda_m$). Thus, we compare all owners to traditional state ownership and focus on $\lambda_m - \lambda_1$ ($m = 2, \ldots, 11$), the effect of switching from traditional state ownership to owner $m$.

The $r_{ijk}$ reflect many observations and it is important to use this fact in estimating (11). If the underlying data are normally distributed, then the variance of $r_{ijk}$ is approximately:

$$\text{var}(r_{ijk}) = \left(1 - r_{ijk}^2 \right) / n_{ijk}$$  \hspace{1cm} (A.9)

Given that $\text{var}(\epsilon_{ijk}) = \text{var}(r_{ijk} | ijk)$, generalized least squares can be employed to use this variance information in estimating the $\lambda_m - \lambda_1$ and their standard errors.5,6

For 30% of the observations, it is not necessary to apply (A.7) since the pertinent t-statistic appears in the paper. We can therefore ask whether there are any systematic differences between the estimated

---

4 For example, if there is information on owners A and B versus owner C and information on A and B versus D, then the effect of C versus D can be estimated without having access to any study that matches C versus D.

5 Since we have estimates of the actual error variances, our GLS procedure uses the assumption that the error variances in the regression are equal to these estimates. The numerical results are easily obtained using any standard GLS routine. However, the standard output must be re-interpreted to take into account the assumptions on error variances. See Hedges (1994).

6 Since each data point is a bilateral comparison and since the number of bilateral comparisons taken from a paper is greater than the number of owners in the paper, some under-estimate of standard errors might occur leading to some over-estimate of the t-statistics in Table 5. This argues for a small amount of discounting of the t-statistics in Table 5.
ownership effects found from these 30% of observations and those found with the remainder of the observations, which use (A.7). This question is addressed by estimating the following equation using generalized non-linear least squares:

\[
    r_{ijk} = \sum_{m=1}^{11} \lambda_m D_{ijk}^m + \gamma D \sum_{m=1}^{11} \lambda_m D_{ijk}^m + \varepsilon_{ijk}
\]

(A.10)

D is a dummy variable equal to 1 when the observation on \( r_{ijk} \) was derived using (A.7). The estimate of \( \gamma \) provides the information on whether we have been too conservative in formulating (A.7). In fact, we did find this to be the case, implying that application of (A.7) leads to \( r_{ijk} \) that are 32% smaller than appropriate.\(^7\) When comparing the \( \hat{\lambda}_m - \hat{\lambda}_1 \) derived from (A.8) and those from (A.10), the latter leads to slightly larger differences in the effects of different owners than those found when estimating (11).\(^8\) This is to be expected given that \( \gamma \) implies that (A.7) creates \( r_{ijk} \) that are smaller than appropriate and that estimation of (A.10) compensates for this. However, the ordering of the effectiveness of the different owners is unchanged. Thus, we conclude that our pragmatic approach to filling in missing information is warranted and does not distort the results. Given the information generated in estimating (A.10), we use the results from this formulation in the paper and in the remaining parts of this Appendix.

As in Section 3, we classified papers into three groups and generated corresponding weights reflecting the papers’ attempts to counter the problem of selection bias. Then in estimating (A.10), we applied these weights to the observations. Thus, in this Appendix we present two sets of estimates, ones that treat all studies equally and ones that more than proportionately reflect the results obtained in papers that pay greater attention to solving the problem of selection bias.

The two sets of estimates appear in Figure A.1. There is a large amount of consistency between them, suggesting that the overall interpretation of the results is not vitiated by the possibility of selection bias. The correlation between the two sets of estimates is 0.70. Nevertheless, the results for some owners, especially managers and workers, do change substantially with the selection bias correction. With the estimates for workers and managers removed, the correlation between the two sets of estimates is 0.96. These facts provide the basis for using the selection-bias corrected estimates in Section 4 and for general confidence in these estimates, except for some residual doubt about managers and workers.

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\(^7\) Formula (A.7) contains two elements, to be applied in different situations. We also tested whether these two elements led to systematically different biases in the estimated partial correlation coefficients, using a method analogous to that in (A.10). The tests strongly endorse the hypothesis that the two biases are equal.

\(^8\) The relevant details are in Djankov and Murrell (2000).
Figure A.1: Judging the Effects of Selection Bias on the Results