What have we learned about the causes of corruption from ten years of crossnational empirical research?

I review recent efforts by political scientists and economists to explain crossnational variation in corruption using subjective ratings, and examine the robustness of reported findings. Quite strong evidence suggests that highly developed, long-established liberal democracies, with a free and widely read press, a high share of women in government, and a history of openness to trade are perceived as less corrupt. Countries that depend on fuel exports or have intrusive business regulations and unpredictable inflation are judged more corrupt. While the causal direction is usually unclear, instrumenting with income as of 1700 suggests higher development does cause lower perceived corruption. However, controlling for income, most factors that predict perceived corruption do not correlate with recently available measures of actual corruption experiences (based on surveys of businessmen and citizens that ask whether they have been expected to pay bribes recently). Reported corruption experiences correlate with lower development, and possibly with dependence on fuel exports, lower trade openness, and more intrusive regulations. The subjective data may reflect opinion rather than experience, and future research could usefully focus on experience-based indicators.

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1 Introduction

In recent years, a growing community of political scientists and economists has sought to understand why in some countries governments and the bureaucrats they control are more corrupt than in others. Corruption is usually understood to mean the "misuse of public office for private gain," where the "private gain" may accrue either to the individual official or to groups or parties to which he belongs. The quintessential corrupt transaction envisioned is the gift of a bribe by a private citizen to a public official in return for some service that the official should either provide for free (e.g. registering a firm) or not provide at all (e.g. inside information). Scholars—like novelists, businessmen, and other global travellers—have long taken it as given that such exchanges occur more frequently in some countries, such as Indonesia or Nigeria, than in others, such as Canada or Iceland.

About a decade ago, attempts to measure and explain such differences received a dramatic boost from two events. First, the Berlin-based organization Transparency International, which campaigns for honest government, began constructing a summary index of countries' "perceived corruption" in the hope of embarrassing their leaders into reform. Second, around the same time an economist, Paolo Mauro, published an article that, using a similar cross-national rating of corruption compiled by a business consultancy, reported evidence of a long-suspected link between higher corruption and slower economic growth (Mauro 1995). Soon others were using such data to investigate what factors explained why some countries' governments were perceived to be more corrupt than others.¹

In this article, I survey the first decade or so of such work. There is already too much to cover comprehensively within the space limits; Lambsdorff (2005) is a useful review. Instead, I

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¹ For early examples, see Ades and Di Tella (1997), La Porta et al. (1999), and Treisman (2000). The growing attraction of corruption studies can be gauged from a quick search of the article database JSTOR. Searching its political science and economics journals for the word "corruption" resulted in 1,945 hits from the 1970s; 2,277 from the 1980s; and 3,278 from the 1990s. Searching for uses of "corruption" and "statistics" in the same text yielded 419 cases from the 1970s; 481 from the 1980s; and 779 from the 1990s.

focus on a few key questions—about the reliability of the data, methods of analysis, and the robustness of certain results. Where possible, I use the data themselves to try to resolve open issues. The goal is to provide a guide to readers of this literature that do not have the relevant data on their hard drive, and to sum up what is known and what is not at the end of this first phase of data exploration. Of course, there are various paths one could follow through this body of work, and different scholars might draw different conclusions on key points. I encourage interested readers to take their own look at the data, which will be posted on my website at http://www.polisci.ucla.edu/faculty/treisman/.

Examination of these data reveals a puzzling dichotomy. The more subjective indexes of perceived corruption—based on evaluations of experts and opinions of businessmen and citizens—turn out to be highly correlated with a variety of factors that are commonly believed to cause corruption. Perceived corruption, as measured by such indexes, is lower in economically developed, long-established liberal democracies, with a free and widely read press, a high share of women in government and a history of openness to trade. It is higher in countries that depend on fuel exports or have intrusive business regulations and unpredictable inflation. These factors explain up to 90 percent of the crossnational variation. However, measures of actual corruption experiences (based on surveys that ask businessmen and citizens in different countries whether they have been expected to pay bribes recently) correlate with hardly any of these factors once one controls for income. Reported experience with corruption correlates with lower development, and possibly with dependence on fuel exports, lower trade exposure, and more intrusive regulations. It is possible that the experience-based measures are noisier and less reliable or are measuring a different phenomenon (petty as opposed to grand corruption, perhaps). But it could also be that the widely-used subjective indexes are capturing not observations of the frequency of corruption but inferences made by experts and survey respondents on the basis of conventional understandings of corruption's causes. I conclude that the challenge of the next wave of research

will be to refine and gather more experience-based measures of corruption and to examine the patterns they reveal.

2 The new data

2.1 Main sources

Two indexes of perceived corruption have become the most commonly used in empirical work—the Corruption Perceptions Index (CPI) constructed by Transparency International (TI) and a rating of control of corruption published by a team led by Daniel Kaufmann at the World Bank (WB). (Details are available at http://www.transparency.org/policy_research/surveys_indices/cpi and htttp://www.transparency.org/policy_research/surveys_indices/cpi and www.worldbank.org/wbi/governance/data.) Both of these aggregate information from a number of sources that include country risk ratings produced by business consultancies, surveys of international or domestic business people, and polls of country inhabitants. Both groups aim to reduce measurement error by averaging different sources, and use similar (and overlapping) sets of inputs. Their methods for constructing indexes differ in two main regards. TI essentially averages the standardized values, while adjusting to reduce the sensitivity of the index to changes in the surveys and countries included. The WB team treats the individual ratings as noisy measures of a common latent variable, and estimates this using an unobserved components mode! (see, e.g., Kaufmann, Kraay, and Mastruzzi 2006). While the WB team includes all countries for which one component rating is available, TI only includes countries for which three ratings are available, which probably increases precision but leads to narrower country coverage.

TI has calculated ratings annually since 1995. The WB group produced its indexes biannually from 1996 to 2002, but now publishes new versions yearly. Coverage has increased over
time—from 54 countries in 1996 to 159 in 2005 for TI, and from 152 to 204 for the WB group
during the same period. Despite the different methodologies and sometimes different sources, the
two ratings are extremely highly correlated. In the years for which both have been available, the

correlation has varied between r = .96 in 2002 and r = .98 in 2004. Both groups also publish the number of sources on which each country's rating is based and estimates of the precision of each country's rating. In TI's case, these standard errors are (since 2001) calculated by a bootstrap methodology. In 2005 the standard error was just .15 for Liberia, suggesting a great deal of agreement about the country's corruption level, but 1.97 for Laos, suggesting far more disagreement. WB publishes standard errors from its unobserved components estimation, which decrease with the number of sources available for the given country and with the extent to which these sources correlate with other sources across all countries.

Although the TI and WB perceived corruption indexes are the most frequently used, a number of studies have analyzed a third crossnational corruption rating produced by the firm Political Risk Services (PRS), based on evaluations by its network of experts, and published in its *International Country Risk Guide* (ICRG). Unlike the TI and WB data, these are only available for purchase. The main attraction of the ICRG data is that ratings are available for all years since the early 1980s, which has tempted some to use them for cross section time series analyses. The ICRG data have been used in the construction of the WB index, and not surprisingly they are highly correlated with both TI and WB (the latest ICRG data I had were for 1995; these correlated at r = .88 with the 1996 TI index and at r = .84 with the 1996 WB rating).

All three of these are based on the subjective evaluations of experts or survey respondents of how widespread or costly corruption is in particular countries. More recently, certain other surveys have asked respondents about their own (or their family's or firm's) experience. In 2004 and 2005, TI conducted a "Global Corruption Barometer" (GCB) survey of inhabitants of 64 and 69 countries respectively, and asked in one question whether the respondent or anyone in his or her household had paid a bribe in any form during the previous 12 months. In the late 1990s, the United Nations Interregional Crime and Justice Research Institute (UNICRI) conducted an international survey of crime victims, which asked respondents whether during the previous year "any government official, for instance a customs officer, police officer or inspector" had asked or

expected the respondent to pay a bribe for his services. UNICRI published the frequencies with which respondents answered positively in different countries. Some surveys have also asked business managers to estimate the proportion of annual revenues that "firms like theirs" typically pay in bribes or unofficial payments. The World Bank's World Business Environment Survey (WBES) interviewed managers in more than 10,000 firms in 80 countries during late 1999 and early 2000. Respondents were read the sentence: "It is common for firms in my line of business to have to pay some irregular 'additional payments' to get things done," and were asked whether this was true always, mostly, frequently, sometimes, seldom, or never. Similar questions have been included in the World Bank and EBRD's BEEPS survey on the transition economies. Wording is often chosen to reduce respondents' fears of self-incrimination—e.g., questions concern "firms like yours"—but it is hoped and assumed that respondents reply based on their own experience. (For details, see www.transparency.org/policy_research/surveys_indices/gcb, www.unicri.it/wwd/analysis/icvs/index.php, and http://info.worldbank.org/governance/wbes/#wbes.)

2.2 How good or bad are the data?

Although research using these data has now been published in the leading journals in political science, economics, and sociology, there have been criticisms and questions about their reliability from the start. A number of issues have been raised.

First, and most obviously, the data do not measure corruption itself, but only opinions about its prevalence. Such opinions may not be based on any direct knowledge and could be biased. Crossnational differences could reflect differences in the socially encouraged level of cynicism, the degree of public identification with the government, and the perceived injustice of social or economic relations. This is particularly problematic since researchers have used the data to make arguments about the relationships between social trust, inequality, and democracy, on the

one hand, and corruption on the other. Likewise, opinions about the extent of corruption might reflect the frequency of muck-raking media reports, of government anti-corruption campaigns, or of politically motivated accusations by opposition politicians. Ratings by international businessmen and experts, disproportionately drawn from developed Western countries, might be influenced by Western preconceptions or by the raters' greater familiarity with certain cultures. Some of the organizations that prepare corruption ratings might also have ideological axes to grind. For all these reasons, "perceived corruption" may reflect many other things besides the phenomenon itself.

Other concerns focus on the aggregation of sources by TI and WB. Some technical issues relate to which methodology is more appropriate, but since the resulting indexes are so highly correlated I ignore them here. The main difference in early years was the far broader country coverage in the WB data—a plus, if increasing coverage is important, but a minus if precision is prioritized. However, some argue that the sources used in constructing both indexes are measuring quite different things, which makes their aggregation problematic. Some sources are evaluations by Western experts; others are polls of international businessmen or country inhabitants. Some surveys ask about the frequency of bribes, some about their size, others about the burden imposed on the economy or about the relative seriousness of the problem. Some focus on low-level administrative corruption, others also seem to include political dirty tricks. Some have narrow regional coverage, others are worldwide in scope. As a result, skeptics wonder what exactly the average is measuring, and suggest that using the different components, selected to match the particular problem at hand, makes more sense. There is a tradeoff between reducing measurement error (if that is what causes surveys to differ) and reducing precision (if surveys are accurately describing distinct phenonena).

Even if precisely the same survey question were asked of the same target group in different countries, it would probably be interpreted differently. What respondents think of as "corruption" may vary substantially from place to place. Even if the word is defined for

respondents, they may have different views about what constitutes "misuse" of public office. And the "seriousness" or "costliness" of corruption will be evaluated relative to different baselines and beliefs about what is normal and what is "serious" in the scheme of things. Having to pay officials five percent of profits might seem a huge imposition in the US, but a relatively minor inconvenience in a country with vast mineral wealth, unpredictable inflation, and rampant organized crime. So besides worrying about comparability across surveys, critics worry about the comparability of responses across countries. (Local differences in the interpretation of "corruption" or evaluations of its "seriousness" are not a problem for the expert assessments, and some cross-national surveys phrase questions carefully to elicit more clearly calibrated answers.)

Of course, researchers are aware of these concerns—for a good discussion, see

Lambsdorff (2004)—and they have responded in several ways. First, some point—not

unreasonably—to the lack of alternatives. Especially when this work began, there were few
obviously more reliable sources of crossnational data about what all agree is a vitally important
subject. One could instead study rates of prosecution or conviction for misuse of office. But these
are as likely to reflect the zeal, competence, and integrity of the police and judiciary, or the
political priority placed on fighting corruption, as they are to capture the true scale of the
phenomenon. Some have found inventive proxies to measure corruption in particular contexts. Di
Tella and Schargrodsky (2003) found that the prices paid by hospitals in Buenos Aires for
homogeneous inputs such as hydrogen peroxide dropped by about 15 percent during an anticorruption campaign, suggesting the scale of previous price-padding or kickbacks. Golden and
Picci (2003) constructed an index of corruption in Italy's regions by comparing the value of
existing infrastructure stocks to past infrastructure spending. Clearly, these approaches would be
hard to extend crossnationally.

More recently, the lack of alternatives has become a somewhat less compelling reason to focus on expert and public opinions about the prevalence of corruption. As noted in the previous section, TI's GCB surveys, UNICRI's Crime Victims survey, and some surveys of business

managers such as the WBES now ask respondents about their (or family members' or similar firms') own experiences of corruption. Such data are also subject to problems—inaccurate or selective memory, fear of reprisals by authorities, etc. But they are less likely to pick up mere impressions based on gossip or popular prejudices than the more subjective survey questions or ratings.

A second justification for using perceived corruption data turns the point about the variety of component sources on its head. That different ratings, produced by different organizations, using different methodologies, and even defining corruption in slightly different ways turn out to be highly correlated among themselves suggests to some that these different spyglasses are aimed at a common target. At least one can say that the results are not purely idiosyncratic. TI reports that among the 16 sources used in its 2005 CPI, the average correlation was r = .87, and the lowest was r = .43 (Lambsdorff 2004). If ratings reflected Western biases, one might not expect the ratings of foreign experts to correlate so highly with surveys of country residents or of businessmen working in the country. For instance the evaluations of the Economist Intelligence Unit's experts in 2005 correlated at r = .87 with those of domestic and international business executives surveyed by the World Economic Forum.

Kaufmann and his colleagues tried to evaluate the extent of ideological bias more systematically (Kaufmann, Kraay and Mastruzzi 2003). They compared the country ratings of different organizations' experts to the average responses on the WBES survey of business people from the country in question, and studied the divergences. They were interested in whether any organization consistently rated countries more corrupt than indicated by the WBES survey when the given country had a left-wing (or a right-wing) government. They found that the Heritage Foundation did rate countries with right-wing governments higher on regulatory quality and rule of law than the surveyed businessmen did. But they did not find any significant ideological biases on corruption ratings.

An obvious question to ask in this context is how closely the subjective indexes correlate with experience-based indicators. In 2001-3, Razafindrakoto and Roubaud (2005) surveyed households in eight African countries about their experiences with corruption. They then questioned a panel of experts, including governance specialists and country scholars, drawn from both developed and developing countries. The experts were asked what they thought the surveyed households would report about the frequency of corruption in their country. For each of the countries—from Burkina Faso to Togo—the experts grossly overestimated the level of corruption that households would report: "On average, 13 per cent of the population experienced acts of corruption in the past year, whereas experts expected a figure of 54 per cent. Moreover, only 5 per cent of the public believed bribery to be an acceptable practice, while experts expected a figure of 54 per cent" (Ibid, p.292). There was no correlation across the eight countries between the rates of corruption expected by the experts and the rates reported by the public. However, the experts' predictions *were* correlated with the WB corruption rating (at r = .65). This might be taken as a sign that experts have a quite coherent set of beliefs about the incidence of corruption that bear little resemblance to realities on the ground.

This particular study might, of course, have caught the experts on a bad day or pick up an isolated gap in expert knowledge. What about the correlations between the GCB, WBES, and UNICRI surveys and the WB and TI indexes? These turn out to be quite highly correlated—with correlation coefficients between about .6 and .8 (see Table 1). Indeed, with the exception of the two years of GCB surveys, which turn out to be highly correlated with each other, the experience-based surveys generally correlate more closely with the TI and WB indexes than with each other. (This may not be surprising in the case of WBES since this is used as a component in the construction of the World Bank corruption scores. However, the others do not seem to have been used for this.) A typical pattern is shown in Figure 1, which graphs the WB index for 2005 against the percentage of respondents to TI's 2005 GCB survey that said that someone in their household had paid a bribe during the previous year. There is quite a strong correlation between

the two indicators, r = -.69. However, what is striking is the far greater variance of reported bribe frequency among the countries that rate low on the WB corruption index. In the developed democracies of Europe and North America, reported bribery is rare and the corruption level is consistently perceived to be low. But among the countries perceived to have the highest corruption, in some like Paraguay or the Cameroons a large proportion of residents report paying bribes, while in others like Venezuela and Nicaragua very few do so. Although reported bribery may be correlated with the aggregations of expert judgments and surveys, the correlation is not as strong as one might expect, especially among the less developed countries. It could be that the two groups are measuring different things, or that the survey respondents are not being frank. Or it could be that, on some countries, the experts are way off.

[Table 1 and Figure 1 About Here]

Even among the residents of a country, opinions may not match reported experience (see Weber Abramo (2006)). The GCB 2005 survey asked respondents to what extent corruption in their country affected politics, the business environment, and their personal and family life. Answers to these questions correlated quite highly among themselves (at r = .77, .54, and .49), but much less with responses to the question whether anyone in the respondent's household had paid a bribe during the previous 12 months (correlations of r = .16, .18, and .30). In fact, the respondents' evaluations of the effect of corruption on politics, business, and their personal and family lives correlated more closely with the WB index than it did with the individuals' own reported experience. It is not just external experts whose opinions seem at times disconnected from concrete experience.

This must at least raise questions about the use of perceived corruption data as one of many criteria for establishing countries' eligibility for US aid under the Millenium Challenge Account. It also raises questions about the interpretation of research findings. Even if one concluded that perceived corruption indexes do not reliably measure the actual frequency of corrupt transactions, there would still be reason to study them. Perceptions—even if not matched

by reality—can have powerful effects. Mauro (1995) found that perceived corruption reduced growth via its effect on investment, but found it harder to establish a link via increased costs or reduced productivity. Other studies have confirmed that higher perceived corruption reduces foreign direct investment. Soares (2004) found that high perceived corruption discourages victims from reporting crimes to the police. So perceptions clearly matter. Nevertheless, the inferences drawn—and the policy implications derived—would be quite different.

A final question about the data is whether they can appropriately be used for longitudinal analysis. A number of studies have stacked annual perceived corruption scores into a time series cross section panel for analysis. In the cases of WB and TI data, this seems ill-advised for several reasons. First, TI has changed the methodology for constructing its CPI over the years, so changes in the index may have nothing to do with change in corruption perceptions. Second, both TI and WB have changed the set of sources used in successive years, so changes in the index might reflect the inclusion of data from new organizations rather than change in corruption perceptions. At the same time, TI has sometimes re-used the same precise surveys in successive years, automatically reducing intervear variation. Both the TI and WB teams caution against reading much into intervear changes unless they are very large. Kaufmann and Kraay (2002, pp.13-14) estimate that about half the variance over time in the WB index results from changes in the sources used and the weights assigned to different sources. Although annual changes in the index should not be taken seriously, Kaufmann and colleauges argue that some changes over longer periods are large enough to be significant. Comparing their results from 1996 and 2004, they suggest that the changes in "5 to 7 percent of countries" are large enough to be considered reliable (Kaufman et al. 2006). Perceived corruption increased during these years in Zimbabwe, Cyprus, Israel, and Moldova, and fell in Latvia, Estonia, the UAE and Bahrain. This could motivate useful case studies, but not the use of panel methods on the whole set of countries.

Various papers have run panel regressions on the ICRG data to assess the determinants of annual changes in corruption. Examination of these data casts doubt on their use for such

purposes. PRS does not explain how its raters ensure that a "3" in one year or in one country means the same as a "3" in another. Moreover, PRS appears to have recalibrated the index several times, causing unexplained jumps in country ratings in particular months (Knack 2006). Casual inspection of the data also turns up a number of abrupt changes that seem puzzling. In 1995, France suddenly drops from a perfect score of 6 to a score of 4, the same level as Mozambique and China. In 1985, Nicaragua jumps from a score of 3, on a par with India, to 5, the level of Austria. It is hard to find any explanation for these sudden changes. Examining longer periods might seem more reliable. But here, too, there are odd changes. Between 1982 and 1995, Egypt, Syria, Iran, Libya, and Tanzania undergo dramatic improvements, rising from the level of Nigeria, 1, to that of Belgium, 4. By 1995, these four countries had surpassed Spain, which fell during this period from a perfect score of 6 to a 3, on a par with Congo or Malawi. It is troubling to reject data merely because they do not fit one's preconceptions—challenging preconceptions is surely what data are useful for. But in this case, the sudden changes are hard to relate to anything in the history of these countries. (Another concern is that the ICRG data actually purport to measure not perceived corruption but the risk of political instability caused by corruption, which may be somewhat different (see Lambsdorff 2005).) Even if there were not such doubts about the data, it is uncertain what sort of lags one should expect for changes in political or economic factors to get translated into higher or lower perceived corruption. It is hard to believe changes in political institutions would affect corruption levels—and then the perceptions of raters—within a single year, the assumption made by most who have analyzed panels. It is much more likely that changes in institutions would cause experts to expect changes in corruption, although they do not observe them directly. Relationships in the data would then reveal somethin g about the experts' theories' about corruption rather than their observations of it. For all these reasons, I treat such panel regressions with much skepticism and do not consider them in this article.

2.3 Methodological questions

A few issues arise in analyzing these data. To start with the purely technical, the data are truncated at both ends by the scales used. Raters are usually required to score countries on a scale from, say, 0 to 6; highly corrupt countries cannot fall below 0 and highly clean ones cannot rise above 6. Although there rarely appears to be enough bunching at the top or bottom to make this a major problem, it does imply that the impact of, for instance, economic development will taper off as countries reach the maximum value for clean government. One should beware of claims that factors such as development have diminishing returns for corruption control. One is bound to find this because of the mode of measurement, regardless of whether it is actually true. Second, the data for the aggregate TI and WB ratings are more-or-less continuous, but ratings such as the ICRG's assign only whole number scores to countries, so ordered Probit is more appropriate than OLS regressions. Still, the OLS estimates tend to be close to those obtained through Probit.

Third, You and Khagram (2005) advocate averaging the values of dependent and independent variables over time to reduce measurement error. Although this may indeed generate more accurate estimates for some variables, it also has some significant costs in that not all intertemporal variation is merely noise. If, for instance, per capita income changes over time, and there is a strong relationship between income in a given year and the level of corruption in the following two years, then regressing average corruption on income averaged over a long period will *create* measurement error and underestimate the strength of the relationship. Such averaging will not affect variables that are relatively constant over time, and may inflate their estimated impact if they are correlated with the meaningful variation in income that has been averaged out.

Fourth, some studies have used such subjective variables as perceived "rule of law" or "bureaucratic efficiency" to explain perceived corruption. Sometimes, the dependent and independent variables are even taken from the same survey or rating agency. The chance that respondents have formed distinct opinions about, on the one hand, the effectiveness of

bureaucratic or judicial institutions, and on the other, the integrity of bureaucrats and judges seems slim. More likely, these variables are measuring the same underlying perception, and so correlations between them will be meaningless. A fifth issue concerns the appropriate significance level. Given the large amount of exploratory data analysis that has gone on with these datasets in a loosely theorized environment, and the danger of publication bias, it probably makes sense for readers to protect themselves by focusing on results that hold at higher levels of significance or that are unusually robust. On the other hand, given the significant problems of measurement and imperfections of the data, it is quite possible that results that do not seem significant or robust are actually correct. So conclusions must be quite provisional and tentative.

The central methodological issues are related, and very hard to solve. Most importantly, there is no widely accepted theory on which to base an empirical model. What theory there is relates to the micro-level—an exchange is imagined between an individual citizen and an official—and the terms of this exchange are traced by sometimes tortuous logic to characteristics of countries on which data are available. As a result, some variables are included in regressions with only quite flimsy notions of how they might cause cross-national variation in corruption. At the same time, some plausible determinants are highly correlated among themselves, rendering it difficult to disentangle their separate effects. To make things worse, many of the supposed causes of corruption may also be caused by it or by some third factor that causes both. Problems of endogeneity are severe, and there are almost no valid instruments that can be assumed to influence corruption by only one pathway.

Consequently, the most important question to ask about published results is how robust they are. In the next section, I try to give the reader a more developed sense of this by reviewing the main findings of some published studies of perceived corruption, reproducing them in recent data, and examining how they stand up to changes in the year of data used and the controls included. One technique sometimes used to test robustness is Edward Leamer's "Extreme Bounds Analysis," which at its simplest involves including all combinations of three variables from a set

of controls. Although this is often valuable, the method's "judgments" can seem somewhat arbitrary. One variable may "fail" because it is highly correlated with others so that its standard errors are high, while another—perhaps relatively weakly related to perceived corruption—may still pass because it is not correlated with any of the other potential determinants. At the same time, the results obviously depend on which variables are included in the initial set of controls, a choice that can itself be quite subjective. This is particularly problematic when combined with the lack of compelling theory to guide selection of the candidate controls. As a result, some papers that have used EBA to assess which determinants of perceived corruption are robust have reported quite different results.

I proceed in a less comprehensive manner. I test whether a reported finding holds in cross-sectional data for the WB and TI perceived corruption indexes for the years 2000, 2002, and 2005, with independent variables adjusted as appropriate (usually lagged by a year or two). I report heteroskedasticity-corrected standard errors and weight countries by the inverse of their standard errors where these are available, in order to place less emphasis on cases where perceived corruption is measured with less precision. I then test whether the results change when I include a battery of historical and cultural variables (dummies for colonial history, prevalence of different religions, type of legal system, ethnic division, recent experience of internal or external war). Where possible—and usually it is not—I try to instrument to control for reverse causation. By the end, I am also able to check that variables found to be significant are robust to inclusion of other significant correlates of perceived corruption. In addition, I explore whether factors that predict variation in perceived corruption also predict variation in the experience-based indicators.

3 Economic development

By far the strongest and most consistent finding of the new empirical work is that lower perceived corruption correlates closely with higher economic development (La Porta et al. 1999, Ades and

Di Tella 1999, Treisman 2000). For instance the correlation between the natural log of per capita GDP at purchasing power parity in 2005 and the 2005 TI index is r = .79, and the correlation with the WB index is r = .81 (recall that the perceived corruption indexes assign higher numbers to less corrupt governments). There is also a strong correlation with the experience-based indicators of corruption. The log of per capita GDP correlated at r = -.74 with the frequency with which business executives told WBES it was necessary to make irregular payments to get things done, at -.72 with the percentage of respondents who told UNICRI they had been asked or expected to pay a bribe in the previous year, and at r = -.78 and r = -.69 with the 2004 and 2005 GCB survey questions on paying a bribe in the last 12 months.

Indeed, there is a strong, negative correlation between current levels of perceived and experienced corruption and estimates of countries' levels of development as of hundreds of years ago. Angus Maddison has estimated per capita GDP for a number of countries from 1500 on (Maddison 2003). As Table 2 shows, current levels of perceived and experienced corruption (as in the WB index and the GCB survey) correlate highly with estimated per capita income from as far back as 1820. (Comparisons of the correlations across years should, of course, take into account the great changes in the number of countries for which data are available, which probably explains the drop in correlations in 1950.) A considerable part of current cross-national variation in corruption levels could be predicted by countries' levels of development almost 200 years ago. By the 1900 income data, the relationship is even more pronounced (see Figure 2). Argentina, whose 20th Century relative income decline has puzzled political economists, stands out as an outlier. This is not to say recent changes in national income are unimportant, but the correlation between per capita GDP today and that in 1900 or even 1820 is high. For the 41 countries with data, the correlation between per capita GDP rank in 1900 and rank in 2002 was .84.

The correlation between economic development and perceived corruption is extremely robust. It survives the inclusion of a variety of controls (for ethnolinguistic fractionalization, latitude, region, religion, culture, democracy, trade, inequality, inflation, and various policy

variables), and can be found in each region of the world. Part of the relationship seems to operate via the association of democratic institutions and free media with both richer countries and lower corruption (the estimated coefficient falls as measures of these are added to regressions—see Section 4). But I did not find evidence that the relationship with development was picking up effects of greater average educational attainment or urbanization in the developed countries.

If the correlation is strong and robust, the question remains what—if anything—it means. Does economic development reduce perceived corruption? Does corruption slow economic development? Are both caused by some third factor? A similar debate has pitted those who believe good institutions explain why some countries developed faster than others (Acemoglu, Robinson, and Johnson 2001; Rodrik, Subramanian, and Trebbi 2004) against those who think economic development explains why some countries acquired good institutions (e.g. Boix and Stokes 2003), and others who believe the accumulation of human capital caused both economic development and superior political institutions (Glaeser et al. 2003).

To establish a direction of causation, one needs good instruments, which are unfortunately in short supply. To be valid, an instrument should both correlate reasonably highly with the corresponding explanatory variable and not affect the dependent variable by any other pathway. To assess the effect of perceived corruption on investment and growth, Mauro (1995) instruments for perceived corruption with an index of ethnolinguistic fractionalization compiled in the early 1960s. His results are not significant for either investment or growth once he introduces basic controls (see his Tables VI and VII, coefficients on corruption index, columns for 2SLS). In any case, ethnolinguistic fractionalization is a dubious instrument since ethnic divisions might reduce growth in many other ways—for instance, by prompting political instability, civil wars, and populist distributive politics (Easterly and Levine 1997), or underinvestment in public goods (Alesina, Baqir, and Easterly 1999).

[Table 2 and Figure 2 About Here]

Another possibility would be to follow Acemoglu et al. (2001) and use the historical mortality rates of European settlers in their colonies as an instrument for corruption today. These settler mortality data are correlated with higher current perceived corruption as measured by either the WB or TI indexes (r = .52 and .56 respectively). However, since the settler mortality instrument is correlated with many possible proximate determinants of development it is hard to say what it is instrumenting for. Acemoglu et al. used it as an instrument for current constraints on the executive and expropriation risk, with which it correlates at about the same rate as with perceived corruption. But, as Glaeser et al (2004) note, the settler mortality data are even more strongly correlated with the current risk of malaria (r = .67 in my data) and the current level of human capital as measured by schooling (r = -.71), both of which would also affect the pace of development. So does the correlation between historical settler mortality and current development reveal that institutional constraints on the executive, traditions of official corruption, low human capital accumulation, or vulnerability to malaria impede development? One cannot be sure.

Looking at the opposite direction of causation, Treisman (2000) used countries' distance from the Equator as an instrument for economic development, and reported evidence that higher development caused lower corruption. However, this is open to objections based on the Acemoglu et al. (2001) arguments already cited. If settler mortality led European colonists to create more exploitative, unaccountable governments in countries with more tropical climates, this might lead to a link from closeness to the Equator to lower development via corruption.

Using Maddison's (2003) laboriously reconstructed historical GDP data, some more evidence can now be adduced. If one is willing to assume that a country's level of per capita income in 1700 affects current corruption perceptions only via the effect on subsequent economic development, then one can use Maddison's estimates of income three hundred years ago as an instrument for current development. (This reduces the number of countries available to 22.) Per capita GDP in 1700 correlates with the natural log of the subsequent change in GDP per capita up to 2002 at r = .29. As the OLS regression in column 1 of Table 3 shows, the change in income

since 1700 is much more closely related to current perceived corruption than is the 1700 level. In column 2, I show a regression with current income per capita instrumented by the 1700 level. Current income instrumented in this way shows up as a significant determinant of perceived corruption in 2005. It is still significant, with a larger coefficient, if I control for colonial history, religion, and legal family (column 3). In columns 4 and 5, in order to increase the number of available countries, I run similar regressions using Maddison's estimate of 1820 GDP per capita as an instrument for current GDP per capita. The coefficient remains significant. Columns 6-8 run regressions using the experience-based GCB and UNICRI data, and instrumenting using Maddison's historical estimates. Although the 1700 GDP per capita instrument leads to a less than significant result for the GCB 2005 data, the 1820 income yields a highly significant result, suggesting that the reported frequency of bribery is lower in countries that grew faster since 1820. Residents in countries that grew faster since 1700 were also less likely to say they had paid a bribe recently on the UNICRI survey.

[Table 3 About Here]

Looking more casually at international experience, some countries have grown extremely rapidly in recent decades despite a perception that their states were highly corrupt. Among the fastest were China, South Korea, Thailand, India, and Indonesia. There is also evidence that countries are more likely to become democratic as they develop economically, although the odds do not necessarily change at the same rate in all eras (Boix and Stokes 2003). In line with this, South Korea, Indonesia and Thailand all improved their Freedom House political rights score by 2-3 points (on a seven point scale) between 1980 and 2005, while India and China remained unchanged. (The median change for this period—which included the fall of communism in Eastern Europe—was an improvement of one point.) As discussed below, democracy—especially if long-lived and liberal in form—is associated with lower perceived corruption. These considerations would seem to suggest a causal pathway from development to perceptions of cleaner government.

4 Political institutions

A number of papers have explored the effect of democratic institutions on perceived corruption. Some have argued that democracy's effects are gradual, and so a long experience of popular government is necessary to lower perceived or actual corruption. Along these lines, others have suggested the relationship is non-linear—democratization may increase corruption in the short run, even if graft is reduced as democracy deepens. Finally, scholars have examined the effects of particular institutions within democracies—the type of electoral rules, whether the regime is parliamentary or presidential, and the degree of freedom of the press—as well as the effect of decentralized government.

Simply regressing perceived corruption indexes on Freedom House's political rights scores (lagged to reduce endogeneity), while controlling for economic development, greater political rights are significantly related to lower perceived corruption for the WB ratings. Political rights remain significant controlling for a variety of other possible determinants, including colonial heritage and religion (see Table 4, columns 1-2). However, the results are somewhat less significant using the TI perceived corruption data, and not always significant for the WB data too if the Polity IV democracy rating is substituted for the Freedom House score.

Montinola and Jackman (2002) note a nonlinear relationship between democracy and perceived corruption; they model this by including a term for the square of their democracy indicator. I also found this signific ant in simple models. However, examining the mean values of perceived corruption for different values of the Freedom House political rights scores suggests a more complicated relationship. Perceived corruption always decreases as democracy increases from 3 to 1 on the FH scale or as authoritarianism softens from 7 to 6, but the effects of movements between 6 and 3 are more erratic. The slight softening of an extreme autocracy (as occurred in Afghanistan in 2003 or Tajikistan in 2007, according to FH) or improvement to a

high level of political freedom (as occurred in Hungary and Poland in 1990) tend to coincide with a fall in perceived corruption. But among imperfect democracies or soft authoritarian states, small increases in freedom do not have a consistent impact on corruption perceptions.

Others have suggested it may take decades for democratic institutions to translate into lower perceived corruption (Treisman 2000). If I include a variable measuring the number of consecutive years the country has been an electoral democracy since 1930 (as classified by Beck et al. 2001), this is highly significant and it reduces the coefficient on the Freedom House score, although the latter remains significant. On examination, this duration of democracy variable turns out to be picking up just the division between those that have been in the democratic club since before 1950 and those that have not. Running the same regression for just countries that have not been democracies in all years since 1950, the coefficient on the duration measure is indistinguishable from zero. So I include a dummy for countries that have been electoral democracies since 1950, which is more significant that the quadratic term in political liberties.

What about institutions within more or less democratic systems? Brunetti and Weder (2003) argue that freedom of the press is particularly important for exposing corrupt officials and deterring the misuse of office. They regress several perceived corruption indicators on an index of press freedom constructed by Freedom House, and get significant results. Along similar lines, Adsera, Boix, and Payne (2003) include a variable measuring the "free circulation of daily newspapers," constructed by interacting a measure of democratic liberties with a measure of newspaper circulation. (They use the interaction on the grounds that "newspaper readership can only generate real political accountability under conditions of democratic freedom" (p.455).) I tried including both these variables, and found both to be significant in regressions of perceived corruption, although the simple measure of newspaper circulation was more significant and robust than the measure interacted with democracy. (Press freedom was not significant in the TI 2005 and 2002 data, but was marginally so in the 2000 index.) The press freedom index is correlated extremely closely with the FH political rights score (r = .94), so it does not make sense

to include both at once—doing so causes the coefficient on political liberties to paradoxically reverse sign. Since press freedom is more significant than political rights, I include it. These variables were quite—but not universally—robust to the inclusion of controls (see Table 4, columns 4-6). As more controls are added, some aspects of democracy become insignificant, which may of course be due to the moderately high correlations among them. The coefficient on "democratic since 1950" falls as countries' colonial history is controlled for (among colonies, former British ones appeared more likely to have been durably democratic), and that on newspaper circulation falls as one controls for religion (Protestant countries have particularly high, and Muslim countries low, newspaper circulation).

Perhaps the most significant constitutional distinction among democratic countries is between those that have a directly elected president with significant powers and those where the executive is elected from within the parliament. Panizza (2001) found that presidential systems were associated with significantly higher perceived corruption (see also Gerring and Thacker 2004 and Lederman, Loayza and Soares 2005). Kunicová and Rose-Ackerman (2005) confirm this and find that presidentialism is particularly harmful when combined with closed-list proportional representation in legislative elections.

I tried two commonly used measures of presidentialism. Beck et. al. (2001) code countries as "2" if the president is directly elected, "1" if a strong president is elected by the legislature, and "0" if there is no president. By contrast, Kunicová and Rose-Ackerman use a simple dummy for whether or not there is a directly elected president. They also restrict their sample to countries with a FH political rights score below 5.5, to eliminate dictatorships. Both indicators of presidentialism turned out to be marginally significant in the WB 2005 regressions and more highly significant in TI 2005 regressions. Since the Kunicová and Rose-Ackerman dummy required dropping a large number of cases, I instead constructed a variable taking the values of the Beck et. al. indicator for countries with FH scores below 5.5, and zero in countries that were not democratic by this criterion. Presidentialism, by this measure, was significantly

associated with higher corruption across different years of data, and was robust to the inclusion of most cultural and historical controls. It became insignificant controlling for Catholicism, apparently because of the corrupt presidential regimes of South America—when a South America dummy was included, presidentialism lost significance. It also lost significance when I controlled for how early the country opened its markets to trade (most democracies that opened early were parliamentary) or for the variability of inflation (see Table 5, discussed in the next section).

[Table 4 About Here]

Scholars have also sought relationships between the type of electoral system and perceived corruption. Persson, Tabellini, and Trebbi (2000) and Kunicová and Rose Ackerman (2005) both argue that accountability of legislators to their constituents should be greatest in plurality systems, followed by open-list proportional representation, with closed-list proportional representation systems generating the greatest corruption. In addition Persson et al. expect corruption to decrease with the size of electoral districts because barriers to entry should be lower and competition for office more intense. Golden and Chang (2006) hypothesize that corruption will increase with district magnitude in open-list PR systems. Finally, as already noted, Kunicová and Rose-Ackerman expect the corruption-inducing effect of presidentialism to be greater under closed list PR.

Here, it seems to me, we are getting close to the end of the information that can be squeezed out of these data. I did manage to construct regressions that reproduced most of these results (although not the interaction of closed list PR with presidentialism or any general effect of district magnitude). However, the results often fell to insignificance if I tried other years or started introducing controls. Although the effects might exist, the evidence for them is fragile. The strongest evidence was that pure plurality systems had less perceived corruption than pure closed list PR ones (the excluded category in Table 4, column 9). It is possible also that the effect of open list PR changes with district magnitude, as suggested by Golden and Chang (the coefficients are of the right signs, although insignificant in colum 9). However, these data seem to

lack the variation necessary to answer this question reliably. A general problem with using these data to test hypotheses about electoral systems is that the arguments are concerned with the accountability of legislators, but the perceived corruption indexes are more focused on the venality of bureaucrats, over whom legislators may have little control.

I also tried regressing the experience-based corruption indicators (the GCB for 2004 and 2005, UNICRI, WBES) on the democracy, presidentialism, and pure plurality system variables. Nothing was significant in the GCB regressions. Presidentialism and press freedom were sometimes marginally significant for the UNICRI survey, but fell to insignificance if I included a variable for dependence on fuel exports (which was significant). A plurality electoral system was associated with lower reported bribery, but this also became insignificant if I controlled for dependence on fuel exports and the time required to register a business. In the WBES data, presidentialism was marginally significant with an unexpected positive sign (suggesting presidential regimes had less corruption), but this became insignificant once any of a number of controls were introduced.

Another question concerns the degree of political decentralization. Treisman (2000) found federalism significantly related to higher perceived corruption using TI data from the mid-1990s. This result was also found by Goldsmith (1999), Kunicová and Rose Ackerman (2005), and Gerring and Thacker (2004). Fisman and Gatti (2002) examined fiscal decentralization, measured by the proportion of state spending that occurred at regional and local levels, as recorded in the IMF's *Government Finance Statistics*, and found a negative relationship between fiscal decentralization and perceived corruption.

Exploring the data now available, I find the link between perceived corruption and federal structure is not at all robust; it disappears as the number of countries included in the WB and TI indexes approaches 100. Federalism's strong significance in regressions using TI's 1996 and 1997 data probably reflected the limited number of countries available for those years. The fiscal decentralization variable is significant at p < .05 in the WB 2005 regression, but it is not

significant in the WB 2002 or 2000 data or in any of the TI indexes. It becomes insignificant in the WB 2005 regressions as well if one controls for religion—in particular, the share of the population that is Protestant. Protestantism is more significant in the same regression, suggesting lower perceived corruption in traditionally Protestant countries (as found in La Porta et al. 1999 and Treisman 2000). The share of Protestants correlates with fiscal decentralization at r = .35. Fiscal decentralization was not significant in regressions for the experience-based indicators.

In short, fairly robust evidence exists that countries with high current levels and long histories of liberal democracy—especially those with a vigorous free press—are perceived to be less corrupt. Parliamentary systems and those with plurality electoral rules for the legislature probably share in the reputation for lower corruption. There is no robust relationship with political or fiscal decentralization. At the same time, there is no solid evidence that the actual frequency of corrupt interactions, as judged by the experience-based data, is related to democratic institutions. And with regard to the perceptions data, endogneity is as great a concern as in the case of economic development. Corruption could itself weaken democratic institutions or could be caused by factors that also undermine democracy. Corrupt rulers are likely to limit press freedom to avoid embarrassing exposure and to limit democratic accountability mechanisms.

Transitions to democracy might give observers the impression corruption had been reduced even if it had not. Researchers have not found any convincing instruments for democratic institutions, so these questions remain unresolved.²

5 Rents and market competition

Ades and Di Tella (1999) argue that corruption will tend to be greater where there are larger economic rents available for bureaucrats to capture. They hypothesize that where the economy is

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² Brunetti and Weder (2003) use Freedom House's political rights score to instrument for Freedom House's press freedom rating. But clearly political rights can affect corruption by channels other than press freedom.

more oriented towards natural resources—and especially the export of these resources—rents and corruption will be higher. At the same time, openness to international trade will intensify market competition and reduce the monopoly power of domestic producers, shrinking the profits available for corrupt officials to extract. They present evidence that the share of imports in GDP and the share of fuels and minerals in exports are both significantly related to perceived corruption. Treisman (2000) found the share of imports in GDP was associated with lower corruption in the TI data from 1996-98, although not always significantly in controlled regressions. Sandholtz and Koetzle (2000), Sandholtz and Gray (2003), and Gerring and Thacker (2005) also found a relationship with trade openness. Treisman (2000) investigated the relationship with exports of fuels, metals, and minerals, the variable Ades and Di Tella had used, but found that in 1990s data (unlike the 1980s data examined by Ades and Di Tella) this became insignificant once income and democracy were controlled for.

Table 5, column 1, shows a regression including the share of imports in GDP. The World Bank's *World Development Indicators* no longer publishes figures on exports of metals and minerals, so I use a measure of the share of fuels in merchandise exports. (I control for economic development and the political variables already found to be significant.) These variables do not appear significant at all in regressions using the WB and TI data from recent years. However, the effect of trade openness is likely to be felt only gradually as competition erodes profit margins and officials are driven out of the market for bribes. I therefore tried including instead a dummy indicating the year in which the country opened its markets to international trade (as classified by Sachs and Warner 1995). (I coded those countries still closed as of 1995 as if they had first opened in 2000.) This variable turned out to be highly significant, and the measure of fuels exports also became significant in the expected direction. These two effects seem quite robust to adding controls and using other years of WB and TI data, although significance levels do sometimes fall below the .05 percent level.

To capture the effect of state regulation on perceived corruption, I tried using several measures of intervention created by Djankov et al. (2002). Djankov et al. found that the number of procedures and the time required to register a business in different countries correlated strongly with the TI index of perceived corruption. I examined how this stood up to a range of controls and uses of different corruption data. I also tried using two indexes constructed by the same team of the extent of "formalism" in the legal procedures necessary to collect on a bounced check and evict a tenant for non-payment of rent (Botero et al. 2004). Greater formalism is associated with greater regulatory interventions and less reliance on an independent judiciary to consider the facts of specific cases. The four indicators were highly correlated. Each was significant in regressions with the WB 2005 corruption data. The time necessary to register a business was the most significant, and it was very robust to the use of different years' data and the inclusion of controls. (In fact, the only variable I found that rendered it insignificant was the variability of inflation, and this might have been just because of the associated sharp drop in the number of cases to 48.)

Again, however, openness to trade and the extent of bureaucratic regulation are highly endogenous and there are few plausible instruments. To instrument trade, some have used a measure of the average distance of a country's capital from the world's 20 major exporters, weighted by the value of bilateral imports (available in the Barro and Lee dataset). However, as Treisman (2000) pointed out, the Barro-Lee distance variable is much more strongly correlated with uninterrupted democracy since 1945 (at r = -.47) and with the natural log of per capita GDP (r = -.49) than it is with imports as a share of GDP (r = -.12), rendering it a dubious instrument for trade. I tried instrumenting with the country's area and a dummy for whether the country was landlocked. The relationship with the year of opening disappeared in these regressions, which might be because of a relatively low correlation between instruments and the year of trade opening. The degree of state regulatory intervention is so endogenous that it is hard to know what to make of this correlation. Djankov et al. suggest the extent of regulatory intervention is largely determined by the origin of the country's legal order, and it is true that the time necessary to

register a business correlates positively with a French-type legal system (r = .43) and negatively with a British-type system (r = .42). However, instrumenting with legal origin yields a result of no significant relationship between regulatory obstacles and the WB corruption index. In other words, high corruption may cause a high level of red tape, but the data do not allow one to conclude that regulatory interventionism leads to higher perceived corruption or that perceived corruption could be reduced merely by limiting regulatory intervention.

[Table 5 About Here]

6 Other factors

Two recent papers have argued that countries in which a larger share of legislators or government ministers are female tend to have lower perceived corruption (Swamy et al. 2001; Dollar, Fisman and Gatti 2001). The logic is somewhat unclear, and seems to run into problems of ecological inference. (The arguments depend on the finding that women, when individually surveyed, appear more public spirited or less tolerant of corruption. But those women who get elected to parliament or appointed ministers are unlikely to be typical of those surveyed; in any case, politicians of either gender are likely to act in office in ways not fully consistent with their answers to abstract questions about professional ethics; and even if most female politicians preferred lower corruption, how a marginal increase in the female share in either the legislature or government could be expected to produce lower corruption at ground level is unclear. The median share of women in the lower house of parliament as of 2000 was about 9 percent and in the government about 12 percent.) Sung (2003) argues that the correlation is spurious, caused by other aspects of liberal democracy that go along with the protection of women's political rights.

Including variables for the share of women in the lower house of parliament as of 2000 and the share of women in the government as of 2001, I found a significant and quite robust relationship with both WB and TI perceived corruption. It was strongest using the measure of women in the government. Nor was it easy to eliminate this with variables that measure other

aspects of liberal democracy. Besides press freedom and long duration of democracy, which were already included, I tried controlling for the government party's margin of victory and the degree of fractionalization of parties.³ From looking at the data, it does not seem that this is just picking up an effect concentrated in Western Europe or Scandinavia, as initially seemed likely. Besides high scores for such countries as Sweden (55 percent of the government female) and Norway (42 percent), the share of women in government was high in Colombia (47 percent), Zimbabwe (36 percent), and Cape Verde (35 percent). Controlling for Western Europe and Scandinavia does reduce the effect but does not eliminate it. And the effect was increased, rather than reduced, by controlling for religion, colonial history, and legal family (Table 5, column 7). The female minister effect does fall sharply if I control for inflation variability, which was itself highly significant (see below). The two are weakly correlated (r = -.22). But the drop in gender's significance could just result from a substantial drop in the number of cases available for this regression. Including gender lowers the coefficients and significance on newspaper circulation and press freedom, so it remains possible that the women in government is picking up the effects of liberal democracy and a vigorous press more precisely than the measures of these.

Some have examined the relationship between perceived corruption and inflation. Braun and Di Tella (2004) argue that high and variable inflation makes monitoring public spending and contracts harder and so increases corruption. They demonstrate a statistical relationship with the ICRG rating. Like them, I tried including in regressions the log of inflation, a dummy for countries that experienced hyperinflation (which I defined as inflation above 100 percent in a year), and the log of the annual variance of monthly inflation rates (I averaged this over three years of data). In my data set, the standard deviation of inflation turned out to be significant and quite robust across corruption measures and controls, although its significance sometimes fell

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³ Sung's (2003) results may depend on his inclusion of a subjective index of "rule-of-law"; the danger that subjective impressions of "rule-of-law" will be conflated with subjective impressions of the extent of corruption seems to me too great to make including such variables advisable.

when a large number of controls were included simultaneously. Unpredictable inflation, thus, does seem to be associated with higher perceived corruption.

Finally, I looked for evidence of a link between corruption perceptions and both income inequality (measured in various ways) and the relative wage in the public sector (as discussed in Van Rijckgehem and Weder 2001). These were not generally significant in regressions including basic controls. This does not mean such relationships do not exist, but I did not manage to find them in any of the data at my disposal

7 Experience-based measures of corruption

In Section 3 I showed that the experience-based UNICRI and GCB corruption measures correlated with per capita income, and that the relationship remained significant using income as of 1700 or 1820 as an instrument for current income. I experimented including the other variables discussed in the previous sections in regressions of experience-based corruption indicators. There were few significant correlations, and given the small number of cases available, few that were robust besides income. (It might be that respondents in some countries are more reluctant to admit to paying bribes and so would reply "don't know" or "no answer" rather than "yes" to survey questions about this. If so, a better measure of the cross-national variation might be the proportion that answer the question with a simple "no". I am grateful to Johann Lambsdorff for suggesting this. Using the percent answering "no" on the GCB 2005 survey yields very similar results. The only variables found to be significant were per capita income and (marginally) the time necessary to open a firm.)

The models in Table 6 show variables that did survive exposure to controls relatively well. The time required to register a business correlated with higher reported corruption, although this was not always significant. Greater exposure to imports was associated with lower reported corruption in the WBES data, although the effect diminished when the number of cases dropped

to 23 in the IV regression. (The imports variable also fell to insignificance if I controlled for population.) Fuel exporters were robustly associated with higher reported frequency of bribery in the UN's crime survey. Other variables—associated with democracy, women in government, or inflation—were not robustly significant, although a plurality electoral system was often correlated with lower bribes in the UNICRI survey.

[Table 6 About Here]

8 Conclusion

The newly available data about corruption perceptions have stimulated an exciting burst of empirical work on what had been a frustratingly difficult topic for social scientists to study. States are perceived by businessmen and their citizens to be less corrupt, we now know, if they are highly developed, long-established liberal democracies, with a free and widely read press, a high share of women in government, and a long record of openness to international trade. Countries are perceived to be more corrupt if they depend on fuel exports, have intrusive business regulations, and suffer from unpredictable inflation. We cannot reliably say that most of these factors *cause* corruption perceptions to be high or low. Evidence of this is strongest for economic development. How corrupt a country is perceived to be today turns out to correlate with how rich it was in 1700—a time when China's income per capita was higher than that of Canada, and the Netherlands was four times as developed as the US. If one assumes that current corruption perceptions are affected by a country's level of economic development 300 years ago only via its effect on subsequent growth, then one can be fairly sure that countries' levels of development affect how corrupt they are perceived to be.

Thus, the good news is that we are getting better and better at constructing indexes of perceived corruption and fitting explanatory variables to the crossnational variation in them. The R²'s now achieved are quite remarkable. The less good news is that these indexes do not correlate as highly as one might expect with what measures we have of citizens' actual experiences with

corruption, based on surveys of business managers and other victims. And most of the factors that predict perceived corruption do not correlate with measures based on direct experience. These facts together raise a nagging suspicion. It is possible that the ratings we have been analyzing measure not corruption itself but guesses about its extent in particular countries that experts or survey respondents have derived by applying conventional theories about corruption's causes, the same conventional theories that inform the hypotheses of researchers, which turn out—surprise!—to fit the data well. Believing democracy reduces corruption, the experts give high grades to democracies; researchers then discover that democracy predicts a low corruption rating.

It might be that the experience-based measures are noisy, and that the corruption perceptions indexes are accurately capturing the true prevalence of corruption. How frequently individuals in their daily life, or company executives in their business activities, have been targeted by venal bureaucrats may not capture what the expert analysts know about the extent of corruption at the state's highest levels. Or survey respondents may not answer as frankly about their own experience. Still, the question is rarely asked just how the experts of PRS and other business consultancies are believed to know about the frequency of bribery, and to be able to assess its change from year to year. What can their sources be? Press reports? Data on criminal convictions? Rumors? Scholars usually treat all these types of information with skepticism on the grounds that they are likely to be biased. Are there other sources available to the risk consultancies, and if so why could researchers not study them directly? The conclusions of the expert raters are treated with an authority proportional to the mystery with which they are constructed.

Based on existing experience-based surveys (Table 6), it appears that economic development does reduce the frequency of demands for bribes. This is confirmed by instrumenting for current income per capita with the level as of 1820, and controlling for countries' colonial history, religion, and type of legal system. A doubling of GDP per capita—roughly the difference between Algeria and Estonia—is associated with a drop of 3-4 percentage

points on the GCB and about 4-5 points on the UNICRI survey in the share of respondents saying they or a family member paid a bribe during the last year. Given that the median responses on these survey questions were about 6 and 7.5 percent respectively, this is quite substantial.

Increasing the share of fuels in exports by 25 percent—the difference between Iceland and Indonesia—is associated with about an 11 point higher reported frequency of bribery on the UNICRI survey. Greater openness to imports may be associated with a lower reported frequency of bribery in the WBES, but the size of the effect is very small. And all surveys suggested more intrusive business regulations may lead to greater reported corruption, but the size and robustness of this effect was less clear.

To question that perceived corruption indexes—and other subjective ratings of "rule of law", "security of property rights", or "bureaucratic effectiveness"—are accurately measuring the target concept is not to deny the value of studying them. As Mauro (1995) and others show, perceptions of corruption or rule of law are important in their own right. They affect investors' decisions, and—at least since the launch of the Millenium Challenge Account—the allocation of foreign aid. If governments are persuaded to democratize and increase female representation in the hope of reducing corruption, that would not be a tragedy. But insofar as research aims to explain corruption itself, there now seem to be alternatives available. The UN Crime Victims' survey, the World Business Environment Survey and others like it, along with several years of TI's Global Corruption Barometer all offer measures of how frequently citizens or business people encounter demands for bribes in different countries. They deserve closer study. (For one early analysis of the UNICRI data, see Mocan (2004).) Resources of international organizations could usefully be redirected from further analysis of perceived corruption to repeating and expanding country coverage of experience-based surveys, while ensuring questions are designed to elicit factual answers about the respondents' own interactions with bribe-soliciting officials. The techniques developed for constructing aggregate indexes of perceived corruption could, as the number of

such surveys increases, be used to provide summary indexes of experienced corruption. Such a focus would invigorate the empirical study of corruption for the next ten years.

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Table 1. Perceived Corruption Ratings and Survey Measures of Experienced Corruption, Correlations

	GCB 04	GCB 05	UNICRI	WBES	WB 00	WB 05	TI 00	TI 05
GCB 04	1	.915**	.504**	655**	740**	728**	735**	699**
N	62	56	33	44	61	62	54	61
GCB 05	.915**	1	.448*	549**	660**	693**	689**	644**
N	56	68	32	48	67	68	55	66
UNICRI	.504**	.448*	1	642**	790**	778**	793**	784**
N	33	32	49	35	49	49	42	49
WBES	655**	549**	642**	1	.744**	.665**	.791**	.688**
N	44	48	35	80	80	80	62	80
WB 00	740**	660**	790**	.744**	1	.922**	.978**	.934**
N	61	67	49	80	187	186	90	158
WB 05	728**	693**	778**	.665**	.922**	1	.955**	.970**
N	62	68	49	80	186	204	90	159
TI 00	735**	689**	793**	.791**	.978**	.955**	1	.967**
N	54	55	42	62	90	90	90	90
TI 05	699**	644**	784**	.688**	.934**	.970**	.967**	1
N	61	66	49	80	158	159	90	159

Notes: ** Correlation significant at the 0.01 level (2-tailed). * Correlation significant at the 0.05 level (2-tailed). WB and TI indexes measure *absence* of corruption. GCB measures percentage of respondents that said they or a family member had paid a bribe in last 12 months. UNICRI measures percentage of respondents that said they had been asked or expected to pay a bribe by a government official during the last year, late 1990s. WBES is country average answer to question "It is common for firms in my line of business to have to pay some irregular 'additional payments' to get things done." This is true: 1 = always,..., 6 = never.

Table 2. Correlations of 2005 Perceived and Experienced Corruption with Maddison's Estimates of Per Capita GDP, 1500-1950

	1500	1600	1700	1820	1900	1950
WB 2005	047	.145	.228	.599**	.791**	.441**
Р	.835	.520	.308	.000	.000	.000
N	22	22	22	46	42	146
GCB 2005	375	360	290	409*	559**	514**
Р	.152	.170	.276	.025	.001	.000
N	16	16	16	30	31	50

Notes: ** Correlation is significant at the 0.01 level (2-tailed). * Correlation is significant at the 0.05 level (2-tailed). For variable definitions, see notes to Table 1.

Table 3. Economic Development and Perceived Corruption

	1	2	3	4	5	6	7	8
	WB 05	WB 05	WB 05	WB 05	WB 05	GCB05	GCB05	UNICRI
GDP per cap. 1700	00 (.00)							
Ln change GDP per cap 1700 – recent year	1.05*** (.20)							
Ln GDP per cap. recent year		1.03** (.40)	1.61*** (.51)	1.05*** (.11)	1.00*** (.25)	-11.50 (6.80)	-6.40*** (1.21)	-7.79*** (1.28)
Constant	-9.03*** (2.01)	-8.89** (4.03)	-14.64*** (4.51)	-9.20*** (1.06)	-9.27*** (2.07)	119.5 (69.8)	68.2*** (12.5)	78.20*** (12.72)
R^2	.706	.708	.841	.781	.884	.293	.423	.945
N	22	22	21	44	40	16	29	16
Method	OLS	IV	IV	IV	IV	IV	IV	IV
Controls	NO	NO	YES	NO	YES	NO	NO	NO

Notes: White-corrected standard errors in brackets, cases weighted by inverse of the standard error. *** p < .01, ** p < .05. For variable definitions, see notes to Table 1. "Recent year" is 2002 for WB05, GCB04, GCB05, and 1995 for UNICRI. Instrument in IV regressions columns 2-3, 6 and 8 is Maddison's estimate of GDP per capita in 1700; in columns 4, 5, and 7, Maddison's estimate of GDP per capita in 1820. Controls for history: percent Protestant 1980, percent Catholic 1980, percent Muslim 1980, British law, French law, German law, Scandinavian law, former British colony, former French colony, former colony of other power except Spain or Portugal.

Table 4. Political Institutions and Perceived Corruption

	1	2	3	4	5	6	7	8	9	10	11
				De	ependent Var	riable: WB '0	5				
Ln gdp per cap. PPP '02 Political rights (low = freer) Pol rights	.62*** (.05) 11*** (.03)	.57*** (.05) 13*** (.03)	.56*** (.07) 42*** (.13) .04***	.52*** (.07) 29** (.13) .03*	.40*** (.06)	.48*** (.06)	.37*** (.06)	.45*** (.06)	.28** (.14)	.40*** (.11)	.46*** (.12)
squared Democratica since 1950 FH press freedom Newspaper circulation '96 Presidential democracy Pure plurality system Open-list system District magnitude Open-list X district mag.			(.02)	(.02) .57*** (.15)	.52*** (.16) .008*** (.003) .0018*** (.0006)	.26 (.18) .012*** (.003) .0012 (.0009)	.49*** (.15) .010*** (.003) .0017*** (.0006) 11** (.04)	.24 (.17) .013*** (.003) .0012 (.0009) 06 (.05)	.45*** (.15) .019*** (.004) .0013** (.0005)18*** (.06) .38* (.19) .22 (.17) .000 (.001)02 (.01)	.34* (.17) .020*** (.005) .0012** (.0006) 19*** (.06)	.28* (.17) .017*** (.005) .0005 (.0007)18** (.07)
Fiscal decent-Ralization Protestant % adherents Including cont-	NO	YES	NO	NO	NO	YES	NO	YES	(.01) NO	.009** (.004)	.006 (.005) .0054** (.0025) Only Prot.
rols for history Constant	-4.98*** (.50)	-4.87*** (.55)	-4.06*** (.72)	-4.00*** (.77)	-3.35*** (.59)	-4.01*** (.56)	-2.91*** (.62)	-3.68*** (.60)	-1.80 (1.27)	-3.02*** (1.08)	-3.55*** (1.10)
R^2	.719	.815	.732	.768	.801	.844	.810	.848	.855	.885	.891
N	162	151	162	156	131	122	129	121	68	55	54

Notes: OLS regressions. White-corrected standard errors in brackets, cases weighted by the inverse of the standard error. *** p < .01, ** p < .05, * p < .10.

a Democratic by classification of Beck et al. (2001). Press Freedom scale adjusted so high value indicates freer press. Definitions of dependent variables as in notes to Table 1. Controls for history as in notes to Table 3.

Table 5. Rents and Competition, Gender, and Inflation

Dependent variable	(1) WB '05	(2) WB '05	(3) WB '05	(4) WB '05	(5) WB '05	(6) WB '05	(7) WB '05	(8) WB '05
Ln gdp per cap. ppp Democratic ^a since 1950 FH press freedom Newspaper circ. '96 Presidential democracy	.37*** (.07) .55*** (.16) .011*** (.003) .0013** (.0005) 10** (.05)	.26*** (.06) .43** (.17) .010** (.004) .0016** (.0006) 08 (.05)	.38*** (.08) .16 (.19) .011*** (.004) .0017* (.0009) .00 (.06)	.24*** (.08) .27 (.21) .008* (.004) .0014** (.0006) 07 (.07)	.26** (.11) .10 (.27) .008 (.005) .0018* (.0009)03 (.08)	.28*** (.10) .10 (.21) .005 (.006) .0012* (.0006) 05 (.08)	.25* (.13)20 (.27) .010* (.006) .003*** (.001)03 (.11)	.18 (.12) .18 (.24) .005 (.007) .0015** (.0007) 06 (.09)
Fuel exports Imports % gdp	001 (.002) .001 (.002)	003** (.001)	004*** (.001)	005*** (.002)	006** (.002)	006** (.002)	007*** (.002)	005** (.002)
Year opened to trade Time required to open firm Women in govt. % Ln SD of inflation	l	013*** (.004)	013** (.005)	012** (.006) 21*** (.07)	016** (.006) 21** (.08)	014** (.007) 19** (.07) .011** (.005)	018** (.008) 15 (.09) .013** (.005)	011 (.007) 09 (.08) .006 (.007) 30*** (.07)
Includes controls for history	NO	NO	YES	NO	YES	NO	YES	NO
Constant R ² N	-2.86*** (.69) .818 111	89 (.70) .836 101	-1.99** (.98) .882 93	.07 (.92) .849 72	.01 (1.31) .894 66	42 (1.21) .852 61	81 (1.54) .918 56	.16 (1.54) .881 48

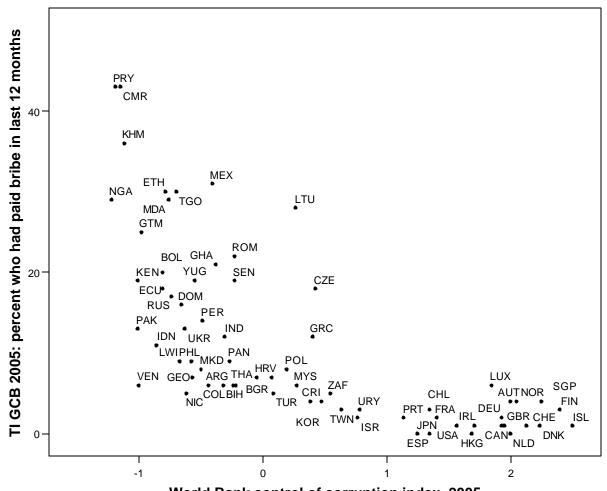
Notes: see Table 4. Fuel exports are as percentage of merchandise exports. OLS regressions.

Table 6. Experience-Based Corruption Measures

Table 0. Exper	1	2	3	4	5	6	7	8	9
	GCB 05	GCB 05	GCB 05	WBES	WBES	WBES	UNICRI	UNICRI	UNICRI
Ln GDP per capita PPP	-4.72*** (.89)	-5.42*** (1.07)	-5.57*** (1.63)	.54*** (.07)	.44*** (.11)	.57** (.22)	-6.27*** (1.03)	-7.79*** (2.38)	-6.69** (2.61)
Time required to open firm	1.65* (.97)	1.77 (1.09)	1.00 (1.22)	17** (.08)	26* (.14)	17 (.13)	1.53** (.74)	01 (1.98)	1.51 (1.05)
Imports, % of GDP				.007** (.003)	.008* (.005)	.005 (.005)			
Fuel Exports							.48*** (.13)	.44** (.20)	.44** (.21)
Constant	46.3*** (10.8)	55.6*** (12.4)	56.9*** (18.6)	04 (.79)	1.35 (1.30)	39 (2.33)	57.5*** (11.6)	75.2** (27.9)	61.8** (28.8)
R^2	.478	.593	.445	.592	.700	.551	.727	.751	.808
N	52	47	29	55	49	23	35	29	22
Method	OLS	OLS	IV	OLS	OLS	IV	OLS	OLS	IV
Controls	NO	YES	NO	NO	YES	NO	NO	YES	NO

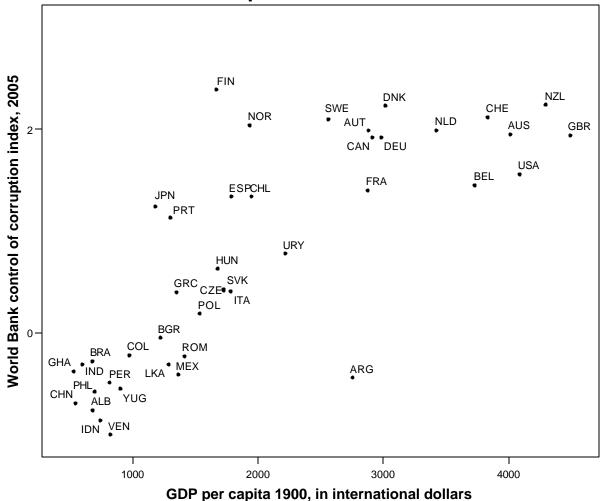
Notes: see previous tables. Instrument for Ln GDP per capita in IV regressions is per capita GDP PPP in 1820 (Maddison 2003).

Figure 1. Perceived and Reported Corruption, 2005



World Bank control of corruption index, 2005 Sources: World Bank, Transparency International.

Figure 2. Perceived Corruption 2005 and Economic Development as of 1900



Sources: Maddison (2003), World Bank.