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# How Does the World Bank Influence the Development Policy Priorities of Low-Income and Lower-Middle Income Countries?

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#### **Abstract**

This study investigates the World Bank's use of lending and non-lending instruments to affect the policy priorities of developing countries. In a typical year, the World Bank lends more than \$30 billion to its client countries. It also spends approximately \$200 million on the provision of analytical and advisory products each year. However, insufficiently granular data on the nature, timing, and distribution of these analytical and advisory products and the policy priorities of client countries has made it difficult for policymakers and scholars to understand which World

Bank instruments are most useful for effectuating change in the direction of government policy. With new data on the delivery of analytical and advisory products and microlevel survey data from 1,244 public sector officials in 121 developing countries, this study demonstrates that the organization's non-lending instruments are more effective than its lending instruments at influencing the policy priorities of client countries. The World Bank's analytical and advisory products not only affect the direction of government policy, but also its design and implementation.

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## How Does the World Bank Influence the Development Policy Priorities of Low-Income and Lower-Middle Income Countries?

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## Introduction

As low-income and middle-income countries have reduced their reliance on official development assistance (ODA) and assumed greater responsibility for direct service delivery activities, many aid agencies and development banks have refocused their efforts on helping partner countries reform laws, institutions, regulations, and customary practices in ways that they hope will promote economic development and effective governance in the long-run (Andrews 2011; World Bank 2012, 2013a; USAID 2015; Buntaine et al. 2017).

However, there is a growing gap between the stated objectives of international development organizations and the metrics of success that they use to judge their own performance. Easily observable output and outcome measures—such as the amount of economic output generated, the number of children vaccinated, and the number of kilometers of roads constructed—are useful for measuring the success of direct service delivery activities (World Bank 2013a; Glennie and Sumner 2014). But most aid agencies and development banks lack credible ways of measuring their influence on the policy priorities of partner countries (Custer et al. 2015; Kremer and Clemens 2016).

The World Bank is a uniquely important case in point. In a typical year, it lends more than \$30 billion to its client countries. It also spends approximately \$200 million on the provision of analytical and advisory (AAA) products to client countries each year. The organization uses both of these instruments—lending and non-lending services—to influence the development policy priorities of low-income and middle-income countries. However, insufficiently granular data on the nature, timing, and distribution of AAA products and the policy priorities of client countries has made it difficult for policymakers and scholars to understand which World Bank instruments are most useful for effectuating development policy change.

In the absence of strong empirical evidence, policymakers have offered conjectures about

<sup>&</sup>lt;sup>1</sup>These summary statistics are drawn from https://www.worldbank.org/en/about/annual-report/fiscal-year-data and the World Bank's Business Intelligence Database.

the value of World Bank advice, analysis, and assistance. Robert Zoellick, who served as the President of the World Bank from 2007 to 2012, characterized his organization as a "unique and special institution of knowledge and learning" and argued that "[d]elivering, expanding, and testing this learning—in tandem with financing or separately—is the most important part of our work" (World Bank 2007, emphasis added). James Wolfensohn, who served as the President of the World Bank from 1995 to 2005, promoted a slightly different version of this argument: "that [the] knowledge and advisory services [of the World Bank] are far more powerful in leveraging policy and institutional change when underpinned by a lending relationship" (Wolfensohn 2000). Others have expressed skepticism. Prior to his appointment as the President of the World Bank in 2019, David Malpass told the U.S. Congress that the principal beneficiaries of the World Bank were "the people who fly in on a first-class ticket to give advice to governments" (Baker 2019).

Nor do scholars agree about whether, when, and how the World Bank promotes policy change within developing countries (Dollar and Svensson 2000; Easterly 2005; Edwards 2007; Helmke and McLean 2014; Smets and Knack 2016, 2018; Masaki and Parks 2019; Carnegie and Samii 2019). Gavin and Rodrik (1995: 332) argue that "the [World] Bank is the single most important external source of ideas and advice to developing-country policymakers" (Gavin and Rodrik 1995: 332). Others in this camp point to highly influential World Bank publications like the *Doing Business Report* (Besley 2015; Doshi et al. 2019) and the organization's role in the global diffusion of policy innovations, such as pension reforms and conditional cash transfer schemes (Brooks 2007, 2015; Fiszbein and Schady 2009; Borges Sugiyama 2011; Handa and Davis 2006; Kremer and Clemens 2016). However, another group of economists and political scientists argue that international financial institutions (IFIs) like the World Bank are relatively impotent and their analysis, advice, and assistance has little if any influence on the policy priorities of developing countries (Remmer 1998; Callaghy 1984; Easterly 2006; Harrigan and El-Said 2006; Samuel 2014).<sup>2</sup>

<sup>&</sup>lt;sup>2</sup>Hunter and Brown (2000: 115) review public policies related to human capital investment in 13 Latin American countries and conclude that "powerful domestic forces tend to override World Bank [policy] di-

To better understand whether, when, and how the World Bank effectuates development policy change, we leverage new data on the organization's lending and non-lending operations as well as a unique survey of 1,328 public officials that measures the policy influence of the World Bank in 24 issue areas and 113 developing countries. We hypothesize that the World Bank's non-lending instruments are more effective than its lending instruments at influencing the policy priorities of client countries. Our empirical results not only provide support for this hypothesis, but also demonstrate that World Bank AAA products influence the design and implementation of government policy.

## Theory and Hypotheses

#### Role of Incentives

The World Bank is a lending institution that depends on governments who are willing to borrow funds and repay their debts. These borrowers have access to two different types of loans: investment loans for stand-alone projects and development policy loans (DPLs) that do not support stand-alone projects but instead provide budget support in exchange for policy reform.<sup>3</sup> The conventional wisdom is that if the World Bank has any influence on the nature, speed, sequencing, and extent of policy reform in developing countries, it is primarily through its DPL program (Smets and Knack 2016, 2018; Giordano and Pagano 2017). A key feature of this program is the fact that financial disbursements are linked to the adoption of specific policy conditions. The World Bank refers to these conditions as "prior actions" (PAs), and its ability to withhold disbursements—or threaten to withhold disbursements—from borrower governments is a major source of bargaining power.

rectives." Similarly, in a review of health care and pension reforms undertaken in Latin America during the 1980s and 1990s, Weyland (2006: 10) finds that "the IFIs most powerful instrument of coercion, loan conditionality, has proven to be a blunt weapon in the enactment of complex institutional reforms. Reforms of social security and health systems involve a wide range of actors. This multiplicity of veto players and the resulting need for political negotiations make it difficult for external actors that lack democratic legitimation to exert much influence."

<sup>&</sup>lt;sup>3</sup>During the 1980s and 1990s, DPLs were known as structural adjustment loans (SALs).

At the same time, there are reasons to question the efficacy of this aid-for-policy program. The World Bank might pick policy conditions that do not reflect local needs and priorities, demand too many conditions, or set arbitrary deadlines that short-circuit the domestic political processes needed to secure the buy-in of various parties with disparate interests (Boughton and Mourmouras 2004; Koeberle et al. 2006). It might also face internal and external pressures—for example, to reward the allies or punish the enemies of powerful shareholders, or to "push money out the door" to achieve professional prestige and budget maximization goals—that undermine the credibility of its policy conditionality (Collier 1997; Dollar and Svensson 2000; Easterly 2005; Kilby 2009).

Notwithstanding these concerns, there is some evidence that DPLs may instigate changes in development policy. After accounting for self-selection bias, Smets and Knack (2016) and Moll and Smets (2018) demonstrate that the cumulative number of World Bank economic policy DPLs contracted by a borrower government is strongly and positively correlated with the quality of its economic policies. Similarly, Giordano and Pagano (2017) provide econometric evidence that DPLs positively correlate with the adoption of business environment reforms in World Bank borrower countries. Rather than focusing on DPLs, Smets and Knack (2018) examine the effects of the PAs that are nested within World Bank DPLs and find evidence of a concave relationship between the cumulative number of PAs and the adoption of public sector governance reforms in World Bank borrower countries: low to moderate levels of conditionality hasten the adoption of public sector governance reforms, while high levels of conditionality have the opposite effect. There are also several studies that suggest World Bank policy lending and conditionality might be more effective in conjunction with the provision of analytical and advisory services (Deininger et al. 1998; Wane 2004; World Bank 2004; IEG 2008a: 40; Fardoust and Flanagan 2011).

<sup>&</sup>lt;sup>4</sup>Self-selection bias—the fact that an unobserved factor or set of factors might influence a government's propensity to pursue DPL-related policy changes—is a major impediment to causal inference. World Bank borrowers might contract DPLs to justify policy changes or insulate themselves from the consequences of policy changes that they would have pursued in the absence of the DPLs (Vreeland 2003; Chwieroth 2007; Parks and Davis 2019).

<sup>&</sup>lt;sup>5</sup>In a 1998 study entitled Assessing Aid: What Works, What Doesn't, and Why, Dollar and Pritchett

Most of these studies rest on the theoretical assumption that the World Bank effectuates policy change by altering the incentives of public sector decision-makers in developing countries. The standard theoretical model is one in which there are two actors—an IFI and a borrower government—that are engaged in a bargaining process. These two actors have well-defined interests and they bargain over financial concessions and policy concessions. The IFI wants to maximize the domestic policy concessions that it can extract from the borrower at the lowest possible cost, and the borrower wants to preserve its domestic policy autonomy while maximizing the financial concessions that it can extract from the IFI (Kremer and Clemens 2016; Girod and Tobin 2016; Masaki and Parks 2019). The IFI's ability to alter the cost-benefit calculation of the borrower is a function of whether the expected benefits of reform exceed the expected costs. Given that reform often produces near-term costs that are concentrated and long-term benefits that are diffuse, those who stand to lose are typically well-prepared to organize themselves in political opposition to change and those who stand to gain face significant collective action problems and demonstrate low levels of political organization (Acemoglu and Robinson 2000; Alesina and Drazen 1991; Rajan 2004). Consequently, the amount, nature, and timing of the funding that the IFI can offer to the borrower are key determinants of whether an aid-for-policy bargain can be reached (Mosley et al. 1995; Masaki et al. 2020). When the IFI increases the level of discretionary funding that is available to the borrower for near-term use, the borrower can more easily compensate the expected losers of distributionally consequential reforms (Robinson 2007; IOB 2012). Therefore, the IFI's ability to convince the borrower that the benefits of reform will exceed the costs is a function of its willingness to provide flexible and fast-disbursing funding.

At the World Bank, DPL funding is easier to disburse and more flexible than funding from investment loans. It is thus considered to be the primary instrument through which

<sup>(1998: 5, 13)</sup> argued that "[t]he key role of development projects should be to support institutional and policy changes that improve public service delivery. [...] Development assistance is more about supporting good institutions and policies than providing capital. Money is important, of course, but effective aid should bring a package of finance and ideas and one of the keys is finding the right combination of the two to address different situations and problems."

the World Bank can effectuate policy change in borrower countries. By way of illustration, consider Indonesia's fuel subsidy reform in 2013 and the apparent role that a World Bank DPL played in its design and implementation. In its written request for a \$400 million DPL, the Indonesian government assured the World Bank that it had put in place a "compensation package [...] [in order] to partly help shield poor households from the impact of higher fuel prices" (Basri and Rajasa 2013). World Bank staff then brought the proposed loan to the Board of Directors for consideration and made the case for approving this large and highly flexible source of funding to the Indonesian authorities on the following basis: "[the Indonesian government will pursue] an expansion of targeted social assistance measures for the poor following an increase in the price of subsidized fuel prices, from 8.5 million households to 15.5 million poor and vulnerable beneficiary households" (World Bank 2013). Therefore, World Bank staff tacitly acknowledged that, by approving the provision of highly flexible financial resources through a DPL, the Board of Directors would enable the Indonesian authorities to pay for the "adjustment costs" of pursuing a fuel subsidy reform.

#### Role of Ideas

However, the World Bank is not only a lending institution. It also produces and disseminates analysis and advice about development policy, which has led some observers to call it a "knowledge bank" (Gilbert et al 1999; Ravallion 2013).

Theories of bargaining power call attention to the financial incentives that IFIs can bring to bear to increase the likelihood that borrowers will challenge the domestic policy status quo, but they do not leave room for the World Bank's causal and principled beliefs about development policy to directly and independently influence the policy priorities of borrower countries. At best, in a setting where the World Bank has provided a financial package to a borrower that is sufficiently attractive to convince the local authorities that the benefits of reform will exceed the costs, the World Bank's ideas about development policy might improve the design of its DPL and thus increase the odds that the DPL will achieve its stated policy objectives (Malesa and Silarszky 2005; Smets et al. 2013; Saavedra et al. 2015).

This blind spot in the literature has prompted some theorization about the conditions under which—and the mechanisms through which—ideas might matter (Meseguer 2006; Macpherson 2006; Kogut and Macpherson 2011; Chwieroth 2012; Weymouth and Macpherson 2012; Smets et al. 2013; Parks and Davis 2019). Social constructivists have proposed that IFIs like the World Bank seek to ally themselves with a small number of reform champions in the executive branch with whom they share causal and principled development policy beliefs. They argue that the presence of "sympathetic interlocutors" helps to align expectations about the appropriateness and likely impact of a given policy choice, thereby facilitating cooperation between IFIs and governments in developing countries (Momani 2005; Chwieroth 2007, 2009, 2010, 2012; Kahler 1992; Corrales 2006; Nelson 2014; Bazbauers 2019).6

This argument enjoys some empirical support. In a wide-ranging review of conditional contracts between IFIs and developing countries, Kahler (1992: 127) finds that "close alignment between a cadre of national economic technocrats and the IFIs seems to have been a prerequisite for [a reform] agreement." Similarly, Chwieroth (2009: 2) provides econometric evidence that the prospects for policy change in developing countries correlate positively with the ability of IFI staff to "find and work with sympathetic domestic interlocutors who embrace their policy goals."

However, existing theory focuses on the *recipients* of policy ideas: those government officials in borrower countries who are willing to promote policy priorities that are consistent with the preferences of the IFIs. It does not shed light on the *mechanisms* that the IFIs use to introduce and promote status-quo-altering ideas about development policy.

<sup>&</sup>lt;sup>6</sup>By way of illustration, consider Salam Fayyad, who served as Prime Minister of the Palestinian National Authority (PNA) from 2007 to 2013. His appointment in 2007 signaled a turning point in the PNA's relations with the international community (Thrall 2010). Fayyad earned his Ph.D. in Economics from the University of Texas at Austin, worked for the World Bank between 1987 and 1995, and became the IMF Resident Representative in the West Bank and Gaza Strip from 1996 to 2001. According to a former Israeli Ambassador to the U.S., Fayyad "[was] the Palestinian figure with the most prestige in the West; they consider[ed] him to be someone who can speak their language" (Ravid 2007). The World Bank also found a kindred spirit and enthusiastic collaborator in Fayyad, which substantially increased the organization's influence over PNA's public sector reform priorities between 2007 and 2013 (World Bank 2012: 20).

Herein lies the principal contribution of our study. The IFIs have codified a specific set of tools to facilitate the transmission of policy ideas to developing countries over time (Arezki et al. 2012; Parks et al. 2015; Fayad et al. 2020; other citations). The World Bank has a particularly wide-ranging set of so-called analytical and advisory (AAA) services. These non-lending services include economic and social work (ESW) and technical assistance (TA). ESW is geared towards informing and influencing the direction and design of policy in client countries, while TA is focused on the implementation of policy (Edwards 1997; Gilbert et al. 1999; World Bank 2004, 2006; IEG 2008b).

We are principally interested in understanding the first-order question of whether, when and how the World Bank influences the direction and design of development policy in its client countries, so we focus here on ESW. The World Bank has five "core [ESW] diagnostic products" that it routinely generates to inform and influence its policy dialogue with borrower countries: Country Economic Memoranda (CEMs) or Development Policy Reviews (DPRs); Country Financial Accountability Assessments (CFAs); Country Procurement Assessment Reviews (CPARs); Poverty Assessments (PAs); and Public Expenditure Reviews (PERs) (IEG 2008b: 14).8

There are several reasons why these analytical and advisory products (or other types of

<sup>&</sup>lt;sup>7</sup>The World Bank defines TA as those activities that are "(a) aimed at enabling an external client to implement reforms or strengthen its institutions; (b) free-standing, not an essential part of another activity such as lending or ESW; and (c) linked to a Bank unit with clear accountability for the service provided" (World Bank 2006).

<sup>&</sup>lt;sup>8</sup>According to World Bank (2004: 86), "[t]he CEM and DPR analyze key aspects of a country's economic development, such as growth, fiscal reform, public administration, foreign trade, financial sector development, and labor markets. They are flexible analytic instruments whose structure and content are largely dependent on country circumstances. Their aim is to provide an integrated view of a country's development priorities and a framework for designing development strategies. [...] The CFA evaluates the overall quality of a country's public financial management system, covering budgeting, accounting, reporting and auditing, and external scrutiny of public finances [...] [and one of its objectives is to] improve a country's public financial management by developing and following up action plans agreed with the government. [...] The CPAR diagnoses the health of the country's procurement system and practices and [aims] to generate a dialogue with governments on needed reforms. [...] The PA provides information on the causes and consequences of poverty in a country and examines how public policies, expenditures, and institutions affect poor people. [...] The PER examines government resource allocations within and among sectors and assesses the equity, efficiency, and effectiveness of those allocations in the context of the macroeconomic framework and sector priorities. In addition, it identifies the reforms needed in budget processes and administration to improve the efficiency of public spending."

ESW) could influence the policy priorities of borrower countries, irrespective of any lending relationships that may exist with the World Bank. In the absence of financial leverage, the World Bank "has to begin by [...] persuading existing [political] leaders that specific reforms should be undertaken" (Woods 2006: 72). These leaders are usually motivated by a desire to stay in power, so uncertainty about the distribution of winners and losers that might result from a reform can reduce their willingness to challenge the status quo (Fernandez and Rodrik 1991). The World Bank can therefore use its analytical and advisory products to provide information about the likely distribution of gains and losses and thereby reduce the uncertainty that political leaders face about the likely consequences of reform (Smets 2020).

Another important feature of the World Bank's analytical and advisory products is that they are often undertaken in collaboration with government officials in the host country. Involving the governing authorities in the process of diagnosing policy problems and formulating policy recommendations may be consequential if it makes political leaders less likely to question the quality and reliability of the analysis and advice that they receive (Masaki and Parks 2019). Indeed, IFIs like the World Bank often lack contextual knowledge about the countries that they are responsible for analyzing and advising and fail to adequately consult with the governing authorities who possess significant informational advantages (Andrews 2013). Therefore, sourcing contextual information from public officials in the country that is being analyzed and advised may reduce perceptions that the diagnostic and advisory content of the World Bank's ESW is biased or otherwise unreliable (Lombardi and Woods 2008). It may also increase the resonance of the findings and recommendations that the World Bank produces for public sector decision-makers in client countries.

To the extent that World Bank ESW gives policymakers in the client country a greater sense of ownership in the policy changes that are being implicitly or explicitly advocated, it may also give them a useful tool for (a) building broader domestic coalitions of support for reform, or (b) neutralizing actors who might oppose reform (Besley and Persson 2011;

Kelley and Simmons 2019; Parks and Davis 2019). Previous research suggests that reform is more likely when it becomes "the business of a wider range of insiders" (Jacoby 2006: 638) and when the general public places pressure on the authorities to follow through on their initial commitments (Abiad and Mody 2005). Therefore, the World Bank's sympathetic interlocutors in client countries might try to make the diagnostic and advisory content in World Bank ESW a "focal point" that can stabilize expectations and lower bargaining costs among the domestic political actors that make and shape government policy (Schelling 1960; Tama 2013). Tama 2013).

Based upon these considerations, we will test the following hypothesis:

H1: The provision of ESW increases the World Bank's ability to influence the policy priorities of its client countries.

#### Data and Methods

Among social scientists, there is a growing recognition that if a central part of the World Bank's raison d'être is to improve the quality of policy in developing countries, those who wish to evaluate the organization's effectiveness need to use outcome measures that can capture changes in government policy—rather than traditional development outcome measures like economic growth and infant mortality (Smets and Knack 2016; Masaki et al. 2020).

<sup>&</sup>lt;sup>9</sup>Indeed, sympathetic interlocutors can serve as policy brokers who not only introduce and promote foreign ideas that challenge the status quo, but also ensure that these ideas are politically acceptable and feasible by building coalitions with domestic political allies and neutralizing domestic political opponents. Amalia Anaya is a case in point (Grindle 2004). She served as the head of Bolivia's Technical Support Team for Education Reform (ETARE) from 1992 to 1994 and played a crucial role in redefining the country's policy priorities and co-opting those who could potentially derail the new set of policy priorities. Despite inauspicious conditions for change, Anaya succeeded in redefining the Bolivian government's educational quality reform agenda during the 1990s, and she did so in part by leveraging analysis and advice from the World Bank and the Inter-American Development Bank. She also pre-empted would-be opponents of the government's new policy priorities by hiring "politically prominent individuals [to staff her reform team] who could establish a bridge to political parties in the country" (Grindle 2004: 97).

<sup>&</sup>lt;sup>10</sup>Tama (2013: 153) defines a focal point as "a proposal or idea around which public debate revolves in a given policy area" and explains that "[o]ne common problem is that negotiations in situations of multiple equilibria sometimes only succeed if someone is able to create a focal point by publicizing an option that becomes the most salient choice."

Elaborating on this point, Kremer and Clemens (2016: 71) note "[i]f one believes that the primary impact of the [World] Bank comes from its specific investments, then one might reasonably evaluate the Bank by assessing what proportion of its investments yield, for example, a 7 percent annual rate of return. If one believes, as we and many other observers do, that the biggest effects of the World Bank arise through its role in influencing developing country policy, then one's assessment of the overall impact of the [World] Bank will hinge primarily on one's beliefs about the effects of these types of policies. A regular bank hopes to obtain a positive return on the vast majority of its investments. In contrast, the World Bank could potentially achieve a high social rate of return through a few big wins [...]. Clearly, if one believes that the [World] Bank has reduced poverty primarily by using its financial resources as part of a bargaining process to promote a few important policy reforms, measuring the Bank's impact becomes difficult. Running a regression with country-level outcomes as the dependent variable and World Bank lending as a key explanatory variable will miss the point if a substantial share of the Bank's impact came from the spread of conditional cash transfers, or reforms inspired by the Doing Business reports, or the impact of former Bank officials on Indian economic reforms in the 1990s."

To help close this evidence gap, we designed and implemented the 2014 Reform Efforts Survey in the summer of 2014 in partnership with the National Opinion Research Center (NORC) at the University of Chicago. It provides a unique source of micro-level survey data on the policy influence of nearly 150 other aid agencies and development banks, as observed and experienced by the local counterparts of these institutions in 126 low-income and middle-income countries.<sup>11</sup>

Unlike traditional elite surveys that are based on convenience sampling (where a population of interest is not identified and sample representativeness cannot be evaluated), we first identified our populations of interest in 126 low-income and middle-income countries and carefully constructed sampling frames for each of these countries in a consistent and

 $<sup>^{11}</sup>$ The questionnaire is available in the online appendix of Parks et al. (2015).

comparable manner, which allows us to evaluate the representativeness of our sample and employ inverse probability weights to adjust for sample selection (i.e., non-response) bias.<sup>12</sup> The process by which we constructed the country-specific sampling frames that were used to facilitate the survey is described in Section B of the Appendix. The master sampling frame consists of 54,990 host government officials, development partner staff, civil society leaders, private sector representatives, and independent experts from 126 low- and lower-middle income countries and semi-autonomous territories.<sup>13</sup>

Altogether, 6,731 individuals participated in the survey. However, for the purposes of this study, we are interested in a specific subsample of respondents: the 1,244 host government officials from 121 low- and middle-income countries who (a) participated in the survey, (b) reported having direct interactions with the World Bank, and (c) subsequently evaluated the agenda-setting influence of the World Bank. Each of these respondents was asked to evaluate the level of influence that the World Bank exerted on the host government's decision to pursue specific reforms over a specific time frame (during the respondent's tenure in a self-identified public sector position and institution) and in a specific policy area (the respondent's self-identified area of policy expertise). These respondents evaluated the influence of the World Bank on a scale of 0 (no agenda-setting influence) to 5 (maximum agenda-setting influence). Given that our sample may not be representative of the population of interest (i.e., the sampling frame), we employ inverse-probability weights to account for unit non-response.

The data from the 2014 Reform Efforts Survey are valuable in that they capture the experiences and observations of public sector officials from the governments that the World

<sup>&</sup>lt;sup>12</sup>For each low- and lower-middle income country, we defined our population of interest as those individuals with direct knowledge of how government policies and programs were prioritized, designed, and implemented between 2004 and 2013. See Section 2 of the Appendix for more details.

<sup>&</sup>lt;sup>13</sup>The specific inclusion criteria and procedures employed to develop the sampling frame are described in detail in Parks et al. (2015).

<sup>&</sup>lt;sup>14</sup>These specific reforms were identified by respondents themselves in a prior survey question that asked them to identify up to three specific problems that government reforms (in the respondent's area of policy expertise) sought to address. In an earlier set of survey questions, each respondent was asked to select his or her primary policy area of focus (from a fixed list 23 different policy areas) and anchor on a specific public sector job and institution (with a defined start year and end year) in a given country between 2004 and 2013. Respondents were then asked to evaluate the influence of specific donors from the vantage point of his or her policy area of focus and country in that particular position and time period.

Bank sought to influence during our period of study (2004-2013). We cannot be certain that all survey respondents provided answers on the basis of policy decisions that they themselves made or directly witnessed, but the types of respondents who participated in the survey are substantially more proximate to the empirical phenomena of interest—World Bank influence on the policy priorities of its client countries—than any other population. A public opinion survey or a survey of experts would have been far less useful, as these populations generally know little about the inner-workings of government (Hoffmann-Lange 2007; Tansey 2007; Parks and Masaki 2019).

Another attractive feature of the 2014 Reform Efforts Survey is that it provides rich data on the individual characteristics of policymakers. The survey asked each government official a battery of questions about his or her position (rank), primary area of policy expertise, job responsibilities, educational background, length of government service, reform orientation, personal communications and interactions with donor agencies and international organizations, etc. We can therefore control for characteristics of policymakers that may affect the ways in which they perceive or report the influence of the World Bank. The fact that the survey asked respondents to evaluate the influence of the World Bank in a specific country, policy domain, and time period also enables us to model with fixed effects at the level of country-policy cluster pairs. We are thus able to expunge the potentially confounding

<sup>&</sup>lt;sup>15</sup>A key strength of the survey is the fact that it includes attributional responses from policymakers with firsthand knowledge of the domestic and external factors that influenced the policy priorities and reform efforts of their governments. However, given that individual respondents evaluated the influence of the World Bank based on their own personal observations and experiences, a natural question that arises is whether these evaluations correlate with independently-generated measures of development policy change. Masaki and Parks (2019) provide evidence that suggests the construct validity of our dependent variable is strong. With data from the 2014 Reform Efforts Survey, they demonstrate that our measure of the World Bank's agenda-setting influence is a strong predictor of improvements on the World Bank's distance to frontier (DTF) measure of the ease of doing business. The DTF measure varies on a scale of 0 to 100, with higher scores indicating greater ease of doing business. Masaki and Parks (2019) find that a one unit increase in respondent ratings of the World Bank's policy influence—within the business environment policy domain—is associated with a 1 percent increase in DTF values over time.

<sup>&</sup>lt;sup>16</sup>To ensure that we have sufficient variation within pairs, we cross-walked the 24 different policy domains in the 2014 Reform Efforts Survey to five broad policy clusters that the World Bank uses to categorize its own activities: macroeconomic and structural policy (MSP), human development (HD), sustainable development (SD), governance (GOV), and other. See Table A1 in the appendix for a description of how we map survey respondents' 24 different policy domains to these five different policy clusters.

effects of observable and unobservable characteristics at the level of country-policy cluster pairs and isolate the *within-pair* variation that is explained by the receipt of World Bank lending and non-lending services.<sup>17</sup>

#### Model

Our baseline statistical model is an ordered probit model summarized in Equation (1).

Influence Rating<sub>i</sub> = 
$$\beta_0 + \beta_1 \text{Assistance}_i + \alpha_1^\top \mathbf{X}_{1i} + \alpha_2^\top \mathbf{X}_{2i} + \sum_{n=1}^{N \times k} \delta_n r_n + \epsilon_i$$
 (1)

In Equation (1), i denotes a survey respondent. Our primary outcome variable—Influence Rating, which represents an individual respondent's assessment of the World Bank's influence on his or her government's decision to pursue reforms in a specific policy domain and time period (the respondent's self-identified area of policy expertise during his or her period of service in a self-identified public sector position and institution)—is drawn from the 2014 Reform Efforts Survey. This variable takes integer values from 0 to  $5.^{18}$   $\beta_0$  is the intercept.  $\beta_1$  is the coefficient for a given form of Assistance.  $\alpha_1$  is a vector of partial effects for a matrix of respondent-country-year-level control variables denoted by  $\mathbf{X}_{1i}$ . While these control variables do not vary within respondents (since there is only one observation per respondent who evaluated the World Bank), they do vary within countries based on the time periods in which respondents held their public sector positions. These measures also vary within country-policy-cluster pairs (i.e., specific policy areas within countries) whenever there

<sup>&</sup>lt;sup>17</sup>By way of illustration, assume that there are two respondents in a given country-policy cluster pair (e.g. Madagascar-Human Development) and the first respondent reports that the World Bank had a high level of influence on the host government's policy priorities and the second respondent reports that the World Bank had a low level of influence on the host government's policy priorities. If the first respondent worked during a period of time (say, 2004-2007) when the World Bank provided a higher level of assistance, analysis or advice to the human development sector and the second respondent worked during a period of time (say, 2008-2011) when the World Bank provided a lower level of assistance, analysis, or advice to the human development sector, a model that uses country-policy cluster pair fixed effects would make it possible to isolate this source of variation. Therefore, our approach allows to isolate variation in the timing of treatment and variation in the timing of when respondents evaluated the policy influence of the World Bank within country-policy cluster pairs.

<sup>&</sup>lt;sup>18</sup>0 denotes no influence. 5 denotes maximum influence.

is more than one respondent in a given country-policy-cluster pair and these respondents did not hold their respective public sector positions during the same period of time.<sup>19</sup>  $\alpha_2$  is a vector of coefficients for our respondent-level controls contained in  $\mathbf{X}_{2i}$ . Here  $\delta_n$  denotes unmeasured time-invariant determinants of the World Bank's policy influence in country-policy-cluster n and  $r_n$  is a country-policy-cluster indicator dummy, with N representing the total number of countries and k representing the total number of policy-clusters in the sample. The term  $\epsilon_i$  is an error term that denotes all unmeasured idiosyncratic factors that affect the World Bank's reported level of policy influence at the individual respondent level.

In order to measure exposure to the World Bank's lending and non-lending services, we extract information on the timing, policy focus, and cross-country distribution of ESW products, DPLs, PAs, and investment loans from the organization's Business Intelligence Database and Development Policy Actions Database. The number of World Bank ESW products received by a country in a given policy cluster and year is our primary variable of interest (n\_esw\_m\_1p) and test of H1. The World Bank assigns each of its ESW products to one of four policy clusters: Macroeconomic and Structural Policy (MSP), Human Development (HD), Sustainable Development (SD), and Governance (GOV). Therefore, we cross-walk these policy cluster-categorized ESW data to the 24 policy domains to which 2014 Reform Efforts Survey respondents anchored their evaluations of the World Bank (see Table A1 in the Appendix). This approach allows to define exposure to the World Bank ESW "treatment" at the country-policy-cluster-year level, so if a respondent worked in a specific country and policy cluster that received ESW from the World Bank during a year in which he or she evaluated the policy influence of the World Bank, we identify the respondent as having experienced exposure to the World Bank ESW "treatment."

Given that the World Bank provides a bundle of lending and non-lending services to its client countries and virtually all of these services have policy objectives, we also construct four additional variables that measure the World Bank's lending services. In order to capture

<sup>&</sup>lt;sup>19</sup>In general, they could vary for any pair that meets these criteria.

exposure to development policy lending, we use two measures—the number of development policy loans and the number of prior actions issued by the organization—that are categorized by the World Bank "policy cluster." We then follow the same cross-walk procedure (see Table A1 in the Appendix) that we used to construct  $n_{-esw_{-}m_{-}1p}$  to measure these variables at the country-policy-cluster-year level. These variables— $dpl_{-}proj_{-}n_{-}m_{-}1p$  and  $pa_{-}m_{-}1p$ —measure whether a respondent worked in a specific country and policy cluster that received one or more DPLs or PAs, respectively, from the World Bank during a year in which he or she evaluated the policy influence of the World Bank.

We also rely on measures of annual per capita disbursements through development policy loans ( $lnaid\_dpl\_disb\_pc\_0\_m\_1p$ ) and annual per capita disbursements through investment loans ( $lnaid\_inv\_disb\_pc\_0\_m\_1p$ ). However, the World Bank does not categorize its financial disbursement data by policy cluster, so these variables are measured at the country-year level. Also, given that  $lnaid\_dpl\_disb\_pc\_0\_m\_1p$ ,  $dpl\_proj\_n\_m\_1p$ , and  $pa\_m\_1p$  are strongly correlated, we never introduce these variables simultaneously to minimize the risk of multicollinearity.

For ease of exposition, we refer to these five measures of exposure to World Bank assistance as "treatment" variables (see Table A2). We set all of these variables to the mean values that they assumed between a respondent's start year and the prior year since the receipt of World Bank assistance in the year prior to a respondent's start year could affect the World Bank's reported level of policy influence in the very next year.<sup>20</sup>

Additionally, in our baseline model, we include six country-level control variables to account for political and economic attributes of countries that may correlate with the extent to which the World Bank influences the policy priorities of its client countries. First, to account for the possibility that a government's propensity to recalibrate its policy priorities is a function of its bargaining power vis-à-vis donors and creditors (Girod and Tobin 2016; Parks and Masaki 2019), we control for net official development assistance as a percentage

<sup>&</sup>lt;sup>20</sup>Due to their highly skewed distributions, we log the two treatment variables with monetary values and replace their missing values with minimum positive values.

of gross national income (aid\_gni\_1st). Second, in recognition of the fact that lower levels of demand for reform in lower income countries may condition the policy influence that the World Bank can exert (Andrews 2011; Loayza et al. 2012), we include a measure of gross domestic product per capita  $(lnqdp_pc_-1st)$ . Third, to account for the possibility that the relationship between income and demand for reform is non-linear, we introduce the squared term of gross domestic product per capita (lnqdp\_pc\_1st\_2).<sup>21</sup> Fourth, to address the possibility that small states lack bargaining power and may need to compensate for their own limited internal administrative and technical capabilities by relying on analysis, advice, and assistance from the World Bank (Vreeland 2003; Pop-Eleches 2009), we control for the size of a country's population (lnpop\_ 1st).<sup>22</sup> Fifth, since democratically-elected governments are generally more motivated to "lock-in" reform commitments and more responsive to external pressures for reform (Kapstein and Converse 2008), we control for regime type, as captured by the POLITY rating (polity2\_1st). Finally, to account for the possibility that a government's political orientation influences the level of effort made by World Bank staff to convince the authorities of the merits of policy reform (Smets et al. 2013), we introduce a dummy variable that takes a value of 1 in country-years when the government in power has a left-wing orientation (left\_1st). To measure these control variables in a way that minimizes the risk of endogeneity, we take the value of each measure during the first year in which a respondent held his or her public sector position.<sup>23</sup>

<sup>&</sup>lt;sup>21</sup>Previous research suggests that middle-income countries have more "outside options" than low-income countries with respect to analytical and advisory service (IEG 2007: 5). Indeed, they often purchase analysis and advice from private sector entities. IEG (2008b: xvi) points to "economic monitoring ESW in [middle-income countries] that had access to such analysis from the private sector or international investors" as a particularly ineffective form of World Bank AAA, noting that "[t]he Bank's economic monitoring ESW had very little value added in such circumstances."

 $<sup>^{22}</sup>$ The  $lnpop\_1st$ ,  $lngdp\_pc\_1st$ , and  $lngdp\_pc\_1st\_2$  variables are logarithmically transformed to correct for their highly skewed distributions.

<sup>&</sup>lt;sup>23</sup>As robustness checks, we calculate two alternative versions of our country-level controls by (a) using the mean of the observed values for the years in which a respondent held his or her public sector position, and (b) setting the values of these variables to those in the year prior to a respondents start year. The rationale for this approach (a) is to account for potential confounds over the full period of treatment. Imagine, for example, that GDP per capita increases sharply between a respondent's start year and end year. If GDP per capita positively correlates with World Bank policy influence, and our control variable does not capture the fact that GDP per capita increased between the respondent's start year and end year, we have omitted an important confound. The rationale for approach (b) is to minimize the risk of endogeneity by using

We also include a set of variables to account for the potentially confounding effects of respondent characteristics and biases. Consistent with the approach taken by Masaki and Parks (2019), we control for sex (sex), level of education (master and phd), public sector institutional affiliation (orgtype), the length of time for which a given respondent worked for the government of the client country (Q1), and his or her area of policy expertise.<sup>24</sup> Additionally, to account for the possibility that a respondent's beliefs about the level of domestic support for reform (in his or her area of policy expertise) colored his or her assessment of the level of influence that the World Bank exerted on host government policy priorities, we control for the reported level of domestic support for reforms among five groups: the executive (head\_support), the legislature (legis\_support), the judiciary (judi\_support), the military (mil\_support), and civil society (civil\_support).

## Results

Our baseline results are reported in Table 1. In columns (1)-(5), we enter each treatment variable into the equation on its own but with a standardized set of control variables. These models, which include country-policy-cluster-fixed effects, account for the confounding effects of observable and unobservable characteristics at the level of country-policy cluster pairs and thereby isolate the within-pair variation in the outcome variable that is explained by the receipt of World Bank lending and non-lending services. Consistent with H1, we find that our primary treatment variable of interest—the number of analytical and advisory products  $(n_-esw_-m_-1p)$  issued by the World Bank—registers a positive and statistically significant effect on the organization's level of influence over the policy priorities of its client countries.

We find that levels of exposure to development policy lending  $(lnaid\_dpl\_disb\_pc\_0\_m\_1p)$  and investment lending  $(lnaid\_inv\_disb\_pc\_0\_m\_1p)$ —in columns (1) and (2)—are negatively associated with the World Bank's level of agenda-setting influence, but only the former is

pre-treatment controls. These results are reported in Section 4.

<sup>24</sup>We control for a respondent's area of policy expertise in two ways. In some model specifications, we include policy cluster fixed effects. In other model specifications, we use country-policy cluster fixed effects.

**Table 1:** Determinants of the World Bank's Influence at the Agenda-Setting Stage of the Policymaking Process

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)	(10)
lnaid_dpl_disb_pc_0_m_1p	-0.06**					-0.01	-0.03	-0.06**		
	(0.03)					(0.02)	(0.02)	(0.03)		
$lnaid_inv_disb_pc_0_m_1p$		-0.01					-0.11***	-0.07	-0.03	-0.02
		(0.04)				(0.01)	(0.04)	(0.04)	(0.04)	(0.04)
n_esw_m_1p			0.21**			0.08*	0.06	0.21**	-	0.23***
			(0.08)			(0.05)	(0.05)	(0.09)	(0.08)	(0.08)
dpl_proj_n_m_1p				0.32*					0.33*	
				(0.18)					(0.18)	
$pa_m_1p$					0.01					0.03
					(0.03)					(0.03)
lngdp_pc_1st	-14.18**							-16.27***		-
	(5.87)	(5.79)		(5.67)	(5.58)	(0.79)	(4.05)	(5.96)	(5.93)	(5.88)
$lngdp\_pc\_1st\_2$	1.06***		0.85**			-0.06	0.08	1.18***	0.89**	0.91**
	(0.38)	(0.37)	(0.36)	(0.37)	(0.36)	(0.05)	(0.27)	(0.39)	(0.39)	(0.38)
lnpop_1st	0.21	-0.30	-0.27	-0.89		-0.15***	-0.86	1.25	-0.01	0.31
.1 .1.	(1.62)	(1.70)	(1.61)	(1.60)	(1.58)	(0.04)	(1.03)	(1.77)	(1.76)	(1.75)
aid_gni_1st	-0.01	-0.01	-0.01	-0.01	-0.01	-0.00	-0.00	-0.01	-0.00	-0.00
1: 0.1 :	(0.01)	(0.01)	(0.01)	(0.01)	(0.01)	(0.00)	(0.00)	(0.01)	(0.01)	(0.01)
polity2_1st	-0.01	-0.00	-0.01	0.00	0.00	0.01	-0.02	-0.02	-0.02	-0.02
left_1st	(0.04) $-0.58*$	(0.04) $-0.52$	(0.04) $-0.66**$	(0.04)	(0.04)	(0.01) $-0.16$	(0.03) $-0.14$	(0.04) $-0.56$	(0.04) $-0.41$	(0.04) $-0.46$
leit_ist	(0.33)	(0.33)	(0.32)	(0.31)	(0.32)	(0.10)	(0.22)	(0.35)	(0.34)	(0.34)
Respondent-level controls	(0.55) Yes	(0.55) Yes	(0.52) Yes	(0.51) Yes	(0.52) Yes	(0.10) Yes	(0.22) Yes	(0.55) Yes	(0.54) Yes	(0.54) Yes
Country-Policy Cluster Pair FEs		Yes	Yes	Yes	Yes	No	No	Yes	Yes	Yes
Country FEs	No	No	No	No	No	No	Yes	No	No	No
Policy Cluster FEs	No	No	No	No	No	Yes	No	No	No	No
Tolley Cluster TEs	110	110	110	110	110	165	110	110	110	110
Observations	686	692	719	719	719	672	787	672	692	692
BIC	3500	3480	3610	3621	3625	2636	3400	3322	3465	3495
AIC	2290	2327	2401	2408	2412	2366	2755	2208	2312	2324

Notes: All regressions use inverse-probability weights to account for variation in unit non-response rate. \* p < 0.1;\*\*\* p < 0.05;\*\*\*\* p < 0.01.

statistically significant at the 95% confidence level. When we use an alternative measure of exposure to development policy lending in column (4)—the number of DPLs issued by the organization  $(dpl_proj_n_m_1p)$ —the direction of the estimate switches to positive and reaches a conventional level of statistical significance. However, exposure to policy conditionality—as measured by  $pa_m_1p$ —is not a statistically significant predictor of the World Bank's agenda-setting influence.

In models (6)-(10), we simultaneously introduce multiple treatment variables to assess their effects independently of one another. We also vary the fixed-effects structure of the models across these columns. In models (6) and (7), which respectively control for policy-cluster-fixed effects and country-fixed effects, we find few statistically significant relationships. However, the  $n_{-}esw_{-}m_{-}1p$  variable remains positive in sign and statistically significant at the 90% confidence level. It is statistically insignificant in Model 7 but still positive in sign.

Columns (8)-(10) are our most rigorous model specifications. They simultaneously introduce multiple treatment variables, while also accounting for unobserved factors that are common to policy clusters within countries. The result that is most consistent across all of these specifications is that the number of ESW products  $(n_esw_m_1p)$  issued by the World Bank is a positive and statistically significant predictor of the level of influence that the World Bank has on the policy priorities of its client countries. The results in Table A10 in the Appendix report the same models from Table 1 using odds ratios. They demonstrate that, holding everything else constant, the provision of each additional ESW product makes the average respondent about 1.24 times as likely to report that the World Bank ranks in the next highest agenda-setting influence category.<sup>25</sup> This effect size is modest, but it is not negligible in light of the limited variability in the outcome variable itself.<sup>26</sup> Also, given that the cost of achieving this higher level of influence is quite low (\$34,376, on average),

 $<sup>^{25}</sup>$ Recall that respondents were asked to evaluate the World Bank with integer values between 0 (no agenda-setting influence) and 5 (maximum agenda-setting influence).

<sup>&</sup>lt;sup>26</sup>The standard deviation of the *influence* measure is 1.33. See Table A2 in the Appendix.

our results imply that ESW is a particularly cost-effective way that the World Bank can influence the policy priorities of its client countries.<sup>27</sup>

A less consistent pattern emerges when we consider the treatment variables that measure exposure to development policy lending and investment lending. One's level of exposure to development policy lending ( $lnaid\_dpl\_disb\_pc\_0\_m\_1p$ ) is negatively and significantly associated with the agenda-setting influence of the World Bank, but the direction and significance of this estimate changes when we use  $dpl\_proj\_n\_m\_1p$  an alternative measure of DPL treatment in column (9). Exposure to policy conditionality ( $pa\_m\_1p$ ) is positive but statistically insignificant.<sup>28</sup>

In Table 2, rather than using an outcome measure that captures the World Bank's influence on the direction of policy (i.e., agenda-setting influence), we use a measure from the 2014 Reform Efforts Survey that asked respondents how much influence the World Bank had over the design of policy. We do so because the stated purpose of World Bank ESW is to influence both the direction and the design of government policy in client countries (World Bank 2004, 2006). The fixed-effects structure of the models in Table 2 is the same as in Table 1. The results demonstrate that the  $n_{-}esw_{-}m_{-}1p$  variable still registers a positive and statistically significant effect.

In Table 3, we replicate the same models but with another outcome measure from the 2014 Reform Efforts Survey: respondent evaluations of the World Bank's helpfulness during

<sup>&</sup>lt;sup>27</sup>ESW products are relatively inexpensive. In 2012, the World Bank delivered 874 ESW products to its client countries at total cost of \$34,266,769. In 2013, it delivered the 772 ESW products to its client countries at a total cost of \$24,503,120. In 2014, it delivered 1,199 ESW products to its client countries at a total cost of \$38,588,088. The average unit cost of an ESW product during this time period (2012-2014) was \$34,376. These summary statistics are drawn from the World Bank's Business Intelligence Database.

<sup>&</sup>lt;sup>28</sup>With some exceptions, the results for the control variables are mostly consistent across the columns in Table 1. Our measure of per capita income ( $lngdp_-pc_-1st$ ) and its squared term ( $lngdp_-pc_-1st_-2$ ) together suggest that increases in per capita income are negatively associated with the World Bank's level of agenda-setting influence, but that this effect dampens at higher levels of per capita income. The population size variable ( $lnpop_-1st$ ) is negatively signed in all but one model, but only statistically significant in model (6). The aid dependence variable ( $aid\_gni\_1st$ ) is negative in all model specifications but never statistically significant (and close to zero). We also find no statistically significant relationship between the strength of democratic institutions ( $polity2\_1st$ ) and the World Bank's level of agenda-setting influence, and the sign of the coefficient changes depending on the model specification. We find some evidence that the World Bank enjoys less policy influence in countries with left-wing governments ( $left\_1st$ ), but this estimate fails to achieve statistical significance in most models.

Table 2: Determinants of the World Bank's Influence at the Design Stage of the Policymaking Process

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)	(10)
lnaid_dpl_disb_pc_0_m_1p	-0.02					0.01	-0.03	-0.04		
	(0.03)					(0.02)	(0.02)	(0.03)		
$lnaid_inv_disb_pc_0_m_1p$		-0.01				0.01	-0.05	0.04	-0.03	-0.02
		(0.04)				(0.01)	(0.04)	(0.05)	(0.04)	(0.04)
$n_esw_m_1p$			0.17*			0.09**	0.12**	0.18**	0.18**	0.20**
			(0.09)			(0.05)	(0.05)	(0.09)	(0.09)	(0.09)
dpl_proj_n_m_1p				0.37*					0.39**	
				(0.19)					(0.19)	
pa_m_1p					0.03					0.04
					(0.03)					(0.03)
$lngdp_pc_1st$	-22.79***	-22.63***	-19.09***	-19.27***	-19.58***	1.16	-5.79	-28.17***	-22.77***	-22.98***
	(7.34)	(7.53)	(6.98)	(7.08)	(7.02)	(0.84)	(4.66)	(7.83)	(7.61)	(7.56)
$lngdp\_pc\_1st\_2$	1.52***	1.48***	1.27***	1.28***	1.30***	-0.10*	0.35	1.87***	1.50***	1.51***
	(0.48)	(0.49)	(0.46)	(0.46)	(0.46)	(0.06)	(0.31)	(0.51)	(0.50)	(0.49)
lnpop_1st	-0.06	0.13	-0.31	-0.86	-0.54	-0.16***	-0.76	1.18	0.22	0.59
	(1.92)	(2.03)	(1.91)	(1.90)	(1.88)	(0.04)	(1.11)	(2.07)	(2.09)	(2.08)
aid_gni_1st	-0.00	-0.00	-0.00	-0.00	-0.00	-0.00	-0.00	-0.00	-0.00	-0.00
	(0.01)	(0.01)	(0.01)	(0.01)	(0.01)	(0.00)	(0.00)	(0.01)	(0.01)	(0.01)
polity2_1st	-0.07*	-0.06	-0.07*	-0.07*	-0.06	-0.00	-0.04	-0.08**	-0.08*	-0.08*
	(0.04)	(0.04)	(0.04)	(0.04)	(0.04)	(0.01)	(0.03)	(0.04)	(0.04)	(0.04)
left_1st	-0.09	-0.06	-0.17	-0.03	-0.10	-0.02	-0.07	-0.11	0.08	0.04
	(0.35)	(0.37)	(0.35)	(0.34)	(0.35)	(0.10)	(0.22)	(0.38)	(0.37)	(0.38)
Respondent-level controls	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Country-Policy Cluster Pair FEs	Yes	Yes	Yes	Yes	Yes	No	No	Yes	Yes	Yes
Country FEs	No	No	No	No	No	No	Yes	No	No	No
Policy Cluster FEs	No	No	No	No	No	Yes	No	No	No	No
Observations	670	675	702	702	702	656	769	656	675	675
BIC	3322	3365	3500	3507	3485	2617	3341	3249	3345	3336
AIC	2209	2245	2334	2337	2333	2352	2690	2155	2230	2230

Notes: All regressions use inverse-probability weights to account for variation in unit non-response rate. \* p < 0.1; \*\*\* p < 0.05; \*\*\*\* p < 0.01.

**Table 3:** Determinants of the World Bank's Helpfulness at the Implementation Stage of the Policymaking Process

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)	(10)
lnaid_dpl_disb_pc_0_m_1p	-0.01					-0.00	-0.06***	-0.04		
	(0.04)					(0.02)	(0.02)	(0.04)		
lnaid_inv_disb_pc_0_m_1p		-0.01				0.02	0.01	-0.01	-0.01	-0.01
		(0.03)				(0.01)	(0.04)	(0.04)	(0.03)	(0.03)
$n_esw_m_1p$			0.24**			0.02	0.02	0.21**	0.22**	0.22**
			(0.10)			(0.04)	(0.05)	(0.09)	(0.10)	(0.10)
dpl_proj_n_m_1p				0.10					0.04	
				(0.19)					(0.19)	
$pa_m_1p$					0.01					0.01
					(0.03)					(0.04)
$lngdp_pc_1st$	-9.01	-10.44*	-9.31	-8.32	-8.61	-0.07	-8.09**	-12.76**	-11.36*	-11.55*
	(5.75)	(6.08)	(5.75)	(5.71)	(5.66)	(0.76)	(3.77)	(6.26)	(6.25)	(6.21)
$lngdp\_pc\_1st\_2$	0.58	0.70*	0.59	0.53	0.55	-0.01	0.61**	0.84**	0.76*	0.77*
	(0.37)	(0.40)	(0.37)	(0.37)	(0.37)	(0.05)	(0.25)	(0.41)	(0.40)	(0.40)
lnpop_1st	3.55**	2.81	4.43**		3.61**		-1.28	3.79**	3.64*	3.70*
	(1.80)	(1.87)	(1.89)	(1.87)	(1.84)	(0.04)	(1.08)	(1.89)	(1.96)	(1.92)
aid_gni_1st	0.01	0.00	0.01	0.01	0.01	-0.00	-0.00	0.00	0.01	0.01
	(0.01)	(0.01)	(0.01)	(0.01)	,	(0.00)	(0.00)	(0.01)	(0.01)	(0.01)
polity2_1st	0.06	0.07	0.05	0.07	0.07	-0.00	0.04	0.05	0.06	0.05
	(0.05)	(0.06)	(0.05)	(0.05)	(0.05)	(0.01)	(0.03)	(0.06)	(0.06)	(0.06)
left_1st	-0.57	-0.58	-0.63*	-0.54	-0.54	-0.03	-0.25	-0.65*	-0.63	-0.61
	(0.37)	(0.37)	(0.36)	(0.36)	(0.36)	(0.12)	(0.21)	(0.38)	(0.39)	(0.39)
Respondent-level controls	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Country-Policy Cluster Pair FEs	Yes	Yes	Yes	Yes	Yes	No	No	Yes	Yes	Yes
Country FEs	No	No	No	No	No	No	Yes	No	No	No
Policy Cluster FEs	No	No	No	No	No	Yes	No	No	No	No
Observations	634	635	657	657	657	621	732	621	635	635
BIC	2944	2901	3011	3078	3046	2319	3036	2833	2900	2913
AIC	1916	1886	1957	1983	1973	2057	2406	1840	1881	1884

Notes: All regressions use inverse-probability weights to account for variation in unit non-response rate.

policy implementation. Here again, the  $n_{-}esw_{-}m_{-}1p$  results mirror those reported in Tables 1 and 2, which suggests that ESW products are not only influential at upstream stages of the policymaking process, but also helpful during downstream policy implementation.

## Robustness Checks

In this section, we undertake a battery of robustness checks and summarize the results reported in the Appendix. First, in Tables A2-A4, we alter the measurement of our treatment and (country-level) control variables by taking their mean values over the duration of a

<sup>\*</sup> p < 0.1; \*\* p < 0.05; \*\*\* p < 0.01.

respondent's tenure in his or her public sector position.<sup>29</sup> We do so to account for the possibility of "late" (and "early") treatment. That is to say, if the receipt of World Bank assistance occurred towards the end of the period of time in which a respondent evaluated the World Bank's level of policy influence (i.e., one of the last years when his/her job required interacting with the World Bank), then one would need to measure treatment exposure over the entire course of the treatment period.<sup>30</sup> When we replicate our baseline models with these alternative treatment and control variables, we obtain similar results. Although some of the estimates are no longer statistically significant, the n\_esw\_mean remains positive in sign and statistically significant in the most rigorous model specification reported in Table A3.

Second, we test whether our results are sensitive to the inclusion of controls that measure a potentially significant confound: client country demand for reform assistance. If the World Bank finds and works with "sympathetic interlocutors" in client countries who share their policy preferences, then it is possible that these government officials would have implemented the World Bank's policy ideas in the absence of ESW. To address this potential threat to inference, we exploit two unique features of the 2014 Reform Efforts Survey: a question that asked each respondent to report how frequently he or she interacted with the World Bank officials via phone, email, video, or face-to-face communications during his or her period of public service,<sup>31</sup> and a question that asked each respondent to reveal the intensity of his or her preferences for status-quo challenging reform.<sup>32</sup> We use the first variable (freq\_comm)

<sup>&</sup>lt;sup>29</sup>We calculate these mean values by using all observations between and including the respondent's start year and end year.

<sup>&</sup>lt;sup>30</sup>We also set our (country-level) control values to their mean values of the duration of a respondent's tenure in his or her public sector position to account for potential confounds over the full period of treatment. By way of illustration, consider the possibility that GDP per capita increased sharply between a respondent's start year and end year. We know that GDP per capita negatively correlates with World Bank policy influence, so if our control variable does not capture the fact that GDP per capita increased between the respondent's start year and end year, we will have omitted a potentially important confound. The two principal disadvantages of this approach are endogeneity and measurement error (if respondent assessments of the World Bank's policy influence are based on actions taken by the World Bank early in their tenure while the measurements of the treatments and controls take into account data from later years).

<sup>&</sup>lt;sup>31</sup>Respondents were allowed to select from one of six response options: once a year or less, 2 or 3 times a year, about once a month, 2 or 3 times a month, about once a week, or daily.

<sup>&</sup>lt;sup>32</sup>Respondents were asked to indicate if they thought that their governments pursued "too much reform,"

as a proxy for the willingness of respondents to engage in policy dialogue with the World Bank. We also use the product of (freq\_comm) and (demand\_reform\_advice) as a more direct measure of the respondent's demand for reform advice from the World Bank. Tables A6 and A7 demonstrate that our core finding related to the effect of World Bank ESW is robust to the inclusion of these additional control variables.

Third, we consider the possibility that our results are biased by a selection effect. Participants in the 2014 Reform Efforts Survey first identified the bilateral and multilateral development institutions with whom they directly engaged during their period of public service, and then evaluated the policy influence of only these institutions. We therefore only observe responses about the level of the World Bank's policy influence from those survey participants who worked directly with the World Bank, which implies that our results could be driven by self-selection bias (if respondents who are more inclined to work with the World Bank are also more inclined to assess its policy influence favorably). The Heckman model accounts for self-selection bias—i.e., the presence of potential confounders that may have affected the propensity of participants to interact with the World Bank (Heckman 1979). In the first (selection) stage of the analysis, we estimate a Probit model (using the full sample) to explain the probability of respondent participation in the outcome stage. Then, in the second (outcome) stage of the analysis, we estimate a standard linear OLS model to predict the World Bank's level of agenda-setting influence. To employ the Heckman model, a variable should be identified that only affects respondents' propensity to interact with the World Bank (included in the selection stage) and does not affect their evaluation of the influence of the World Bank (excluded from the outcome stage) (Sartori 2003). For this purpose, we use a variable that measures the number of bilateral and multilateral development institutions with whom a participant interacted during his or her period of public service (number\_org). This variable captures the general propensity of survey respondents to interact with aid agencies and development banks, including the World Bank, but we do not have any strong

<sup>&</sup>quot;too little reform," or "about the right amount" within their respective areas of policy expertise and between their start dates and end dates in specific public sector positions.

theoretical reasons to believe that it will independently affect how participants evaluate the World Bank. Indeed, as the selection stage in Table A8 demonstrates, *number\_org* is highly significant and positively correlated with the selection variable. The results of the outcome stage also show that our key finding—the positive relationship between the provision of ESW and the World Bank's level of agenda-setting influence—is robust to this correction for self-selection bias.

Fourth, we conduct a placebo test using the average agenda-setting influence evaluations of three other donors—the European Union, the United Nations Development Program, and United States Agency for International Development—for respondents who evaluated those donors and the World Bank. We find no relationship between the World Bank's provision of ESW and the reported policy influence of these donors (see Table A9).

Fifth, we take advantage of another unique feature of the 2014 Reform Efforts Survey: the fact that those respondents who indicated familiarity with one or more of the World Bank's core ESW products were asked to independently evaluate the agenda-setting influence of those particular analytical and advisory products (as opposed to the World Bank's policy influence on the whole).<sup>33</sup> Table A10 demonstrates that our main findings are insensitive to the use of this alternative dependent variable.

<sup>&</sup>lt;sup>33</sup>The World Bank's core ESW products include Country Economic Memoranda (CEMs), Development Policy Reviews (DPRs), Country Financial Accountability Assessments (CFAs), Country Procurement Assessment Reviews (CPARs), Poverty Assessments (PAs), and Public Expenditure Reviews (PERs). Participants in the 2014 Reform Efforts Survey evaluated four of these ESW products (CEMs, DPRs, CFAs, and PA), so we use only these data. Since this outcome variable is measured at the respondent level, we average across the set of core ESW diagnostic products that a respondent evaluated.

## Concluding Remarks

This study provides evidence that the analytical and advisory products of the World Bank are effective at influencing the design, direction, and implementation of government policy. By contrast, we do no find robust evidence that the World Bank's development policy lending or investment lending services consistently influence government policy in low-income and middle-income countries. These results have significant policy implications. For every dollar that that the World Bank spends on non-lending services (or analytical and advisory products), it spends approximately \$150 dollars on lending services.<sup>34</sup> Therefore, if a central goal of the World Bank is to influence government policy in its client countries, our results imply that it can achieve better value-for-money through its provision of ESW products.

Our study also highlights the value of collecting granular data on (a) the nature, timing, and distribution of analysis and advice from aid agencies and development banks, and (b) the direction, design, and implementation of policies in low-income and middle-income countries. In the absence of treatment and outcome variables with significant variation across countries, policy areas, and time, it would not have been possible to benchmark the policy influence effects of the World Bank's lending and non-lending services. Our study therefore calls attention to a broader lesson: relatively inexpensive investments in the collection of data can help international development organizations that aspire to influence government policy measure the effectiveness of the instruments that they create for this express purpose.<sup>35</sup>

<sup>&</sup>lt;sup>34</sup>This is a lower-bound estimate based on the conservative assumption that the World Bank allocates \$30 billion a year to lending services and \$200 million a year to non-lending services.

<sup>&</sup>lt;sup>35</sup>It cost approximately \$500,000 to design and implement the 2014 Reform Efforts Survey. The Development Research Group of the World Bank contributed \$113,000 to this effort.

## References

Abiad, A., and A. Mody. 2005. Financial reform: What shakes it? What shapes it? American Economic Review 95(1): 6688.

Acemoglu, D., and J.A. Robinson. 2000. Political losers as a barrier to economic development. *American Economic Review* 90: 126130.

Alesina, A., and A. Drazen. 1991. Why are stabilizations delayed? *American Economic Review* 81(5): 11701188.

Andrews, Matthew. 2013. The limits of institutional reform in development: changing rules for realistic solutions. Cambridge: Cambridge University Press.

Arezki, Rabah, Marc Quintyn, and Frederik Toscani. 2012. Structural Reforms, IMF Programs, and Capacity Building: An Empirical Investigation. IMF Working Paper 12/232. Washington DC: International Monetary Fund.

Baker, Peter. 2019. Trump to Nominate David Malpass to Lead the World Bank. 4 February 2019. New York Times.

Bazbauers, Adrian Robert. 2019. World Bank technical assistance: Locating and cultivating sympathetic interlocutors. *Development Policy Review* 37 (5): 638-656.

Basri, Muhamad Chatib and Hatta Rajasa. 2013. Letter of Development Policy to Mr. Jim Yong Kim. 30 September 2013.

Besley, T., and T. Persson. 2011. *Pillars of Prosperity*. Princeton: Princeton University Press

Besley, Timothy. 2015. Law, regulation, and the business climate: The nature and influence of the World Bank doing business project. *Journal of Economic Perspectives* 29(3): 99120.

Borges Sugiyama, Natasha. 2011. The Diffusion of Conditional Cash Transfer Programs in the Americas. *Global Social Policy* 11(23): 25078.

Boughton, James M. and Alex Mourmouras. 2004. "Whose Programme Is It? Policy Ownership and Conditional Lending" in *The IMF and Its Critics: Reform of Global Financial Architecture*, edited by D. Vines & C. L. Gilbert. New York: Cambridge University Press.

Brooks, Sarah M. 2007. When Does Diffusion Matter? Explaining the Spread of Structural Pension Reforms Across Nations. *The Journal of Politics* 69 (3): 701-715.

Brooks, Sarah M. 2015. Social Protection for the Poorest: The Adoption of Conditional Cash Transfers in the Global South. *Politics & Society* 43 (3) 551-582.

Buntaine, Mark T., Bradley C. Parks and Benjamin P. Buch. 2017. Aiming at the wrong targets: the domestic consequences of international efforts to build institutions. *International Studies Quarterly* 61(2): 471488.

Callaghy, Tom. 1984. Africa's Debt Crisis. Journal of International Affairs 38(1): 6373.

Carnegie, Allison and Cyrus Samii. 2019. International Institutions and Political Liberalization: Evidence from the World Bank Loans Program. *British Journal of Political Science* 49 (4): 1357- 1379.

Corrales, Javier. 2006. "Political Obstacles to Expanding and Improving Schooling in Developing Countries." In *Global Educational Expansion: Historical Legacies and Political Obstacles*, edited by Aaron Benavot, Julia Resnik and Javier Corrales. Cambridge, MA: Academy of Arts and Sciences. Pp. 91-148.

Chwieroth, Jeffrey M. 2007. Neoliberal Economists and Capital Account Liberalization in Emerging Markets. *International Organization* 61 (2): 443-463.

Chwieroth, Jeffrey M. 2009. Capital Ideas: The IMF and the Rise of Financial Liberalization. Princeton: Princeton University Press.

Chwieroth, Jeff. 2010. "Shrinking the State: Neoliberal Economists and Social Spending in Latin America," in *Constructing the International Economy*. Rawi. Abdelal, Mark Blyth, and Craig Parsons (Eds) Ithaca, NY: Cornell University Press. pp. 23-46.

Chwieroth, Jeffrey. 2012. "The silent revolution": how the staff exercise informal governance over IMF lending. Review of International Organizations 8 (2): 265-290.

Collier, Paul. 1997. "The Failure of Conditionality. In *Perspectives on Aid and Development*. Edited by C. Gwin and J. Nelson. Washington, DC: Overseas Development Council.

Custer, Samantha, Zachary Rice, Takaaki Masaki, Rebecca Latourell, and Bradley Parks. 2015. Listening to Leaders: Which Development Partners Do They Prefer and Why? Williamsburg, VA: AidData.

Deininger, Klaus, Lyn Squire, and Swati Basu. 1998. Does Economic Analysis Improve the Quality of Foreign Assistance? World Bank Economic Review 12(3): 385-418.

Dollar, David and Lant Pritchett. 1998. Assessing Aid: What Works, What Doesnt and Why. Oxford: Oxford University Press.

Dollar, David and Jakob Svensson. 2000. What Explains the Success or Failure of Structural Adjustment Programmes? *The Economic Journal* 110 (466): 894-917.

Doshi, Rush, Judith G. Kelley and Beth A. Simmons. 2019. The Power of Ranking: The Ease of Doing Business Indicator and Global Regulatory Behavior. *International Organization* 73 (3): 611-643.

Edwards, Sebastian. 1997. Trade Liberalization Reforms and the World Bank. American Economic Association Papers and Proceedings 43-48.

Glennie, Jonathan, and Andy Sumner. 2014. The \$138.5 Billion Question: When Does Foreign Aid Work (and When Doesnt It)? Center for Global Development Policy Paper 049.

Easterly, William. 2005. What Did Structural Adjustment Adjust? The Association of Policies and Growth with Repeated IMF and World Bank Adjustment Loans. *Journal of Development Economics* 76: 1-22.

Easterly, William. 2006. The White Mans Burden: Why the Wests Efforts to Aid the Rest Have done So Much Ill and So Little Good. New York: Penguin Press.

Fardoust, S. and A. E. Flanagan. 2011. Quality of Knowledge and Quality Financial Assistance: A Quantitative Assessment in the Case of the World Bank. Washington, DC: Development Economics. Mimeo. Washington DC: World Bank.

Fernandez, Raquel and Dani Rodrik. 1991. Resistance to Reform: Status Quo Bias in the Presence of Individual-Specific Uncertainty. *American Economic Review* 81(5): 1146-1155.

Fiszbein, Ariel, and Norbert Schady. 2009. Conditional Cash Transfers: Reducing Present and Future Poverty. A World Bank Policy Research Report. With Francisco H. G. Ferreira, et al. Washington, DC: World Bank.

Gavin, Michael, and Dani Rodrik. 1995. The World Bank in Historical Perspective. American Economic Review 85(2): 32934.

Gilbert, Christopher, Andrew Powell, and David Vines. 1999. Positioning the World Bank. Economic Journal 109(459): 598633.

Giordano, R., and P. Pagano. 2017. Does the World Bank Foster Business? World Bank Policy Research Working Paper No. 8047. Washington DC: World Bank.

Girod, D. M. and Tobin, J. 2016. Take the money and run: The determinants of compliance with aid agreements. *International Organization* 70(1): 209239.

Grindle, Merilee. 2004. Despite the Odds: The Contentious Politics of Education Reform. Princeton, NJ: Princeton University Press.

Handa, Sudhanshu, and Benjamin Davis. 2006. The Experience of Conditional Cash Transfers in Latin America and the Caribbean. *Development Policy Review* 24(5): 51336

Harrigan, Jane and Hamed El-Said. 2006. The IMF and the World Bank in Jordan: A Case of Over-Optimism. *The Review of International Organizations* 1 (3): 263-292.

Heckman, James J. 1979. Sample selection bias as a specification error. *Econometrica* 47(1): 153-61.

Helmke, Gretchen and Elena V. McLean. 2014. Inducing Independence: A strategic model

of World Bank assistance and legal reform. Conflict Management and Peace Science 31(4): 383-405.

Hoffmann-Lange, U. 2007. Methods of elite research. In Oxford Handbook of Political Behavior, edited by R. J. Dalton and H.-D. Klingemann. Oxford: Oxford University Press. pp. 910927

Hunter, W. and D. S. Brown. 2000. World Bank directives, domestic interests, and the politics of human capital investment in Latin America. *Comparative Political Studies* 33 (1): 113-143.

Independent Evaluation Group (IEG). 2007. Development Results in Middle-Income Countries: An Evaluation of the World Banks Support. Washington DC: World Bank.

Independent Evaluation Group (IEG). 2008a. Public Sector Reform: What Works and Why? An IEG Evaluation of World Bank Support. Washington, DC: World Bank.

Independent Evaluation Group (IEG). 2008b. Using Knowledge to Improve Development Effectiveness: An Evaluation of World Bank Economic and Sector Work and Technical Assistance, 20002006. Washington, DC: World Bank.

IOB. 2012. Budget Support: Conditional Results. Review of an Instrument (2000-2011).IOB Evaluation No. 369. Policy and Operations Evaluation Department (IOB). Netherlands: Ministry of Foreign Affairs.

Fayad, Ghada Chengyu Huang, Yoko Shibuya, and Peng Zhao. 2020. How Do Member Countries' Receive IMF Policy Advice: Results from a State-of- the-art Sentiment Index. IMF Working Paper WP/20/7. Washington DC: IMF.

Jacoby, Wade. 2006. Inspiration, coalition, and substitution: External influences on post-communist transformations. *World Politics* 58(4): 623651.

Kahler, Miles. 1992. "External Influence, Conditionality, and the Politics of Adjustment. in *The Politics of Economic Adjustment*, edited by Stephan Haggard and Robert R. Kaufman. Princeton, NJ: Princeton University Press. Pp. 89-133.

Kapstein, Ethan B. and Nathan Converse. 2008. The Fate of Young Democracies. Cambridge, UK: Cambridge University Press.

Kelley, Judith G. and Beth A. Simmons. 2019. Introduction: The Power of Global Performance Indicators. *International Organization* 73 (3): 491-510.

Kilby, Christopher. 2009. The Political Economy of Conditionality: An Empirical Analysis of World Bank Loan Disbursements. *Journal of Development Economics* 89 (1): 51-61.

Koeberle, S, Stavreski, Z, and Walliser, J., eds. 2006. Budget Support as More Effective Aid? Recent Experiences and Emerging Lessons. Washington, DC: The World Bank.

Kogut, B., and J. M. Macpherson. 2011. The Mobility of Economists and the Diffusion of Policy Ideas: The Influence of Economics on National Policies. *Research Policy* 40: 13071320.

Kremer, Michael and Michael Clemens. 2016. The New Role for the World Bank. *Journal of Economic Perspectives* 30 (1): 5376.

Loayza, N., J. Rigolini, and G. Llorente, G. 2012. Do middle classes bring institutional reforms? World Bank Policy Research Working Paper 6015. Washington DC: World Bank.

Lombardi, D., and N. Woods. 2008. The politics of influence: An analysis of IMF surveillance. Review of International Political Economy 15(5): 709737.

Malesa, Thaddeus and Peter Silarszky. 2005. "Does World Bank Effort Matter for Success of Adjustment Operations? In *Conditionality Revisited: Concepts, Experiences, and Lessons*, edited by Stefan Koeberle, Harold Bedoya, Peter Silarsky, and Gero Verheyen. Washington, DC: The World Bank.

Masaki, Takaaki and Bradley Parks. 2019. When Do Performance Assessments Influence Policy Behavior? Micro-Evidence from the 2014 Reform Efforts Survey. *The Review of International Organizations* [forthcoming]

Masaki, Takaaki, Bradley Parks, Jörg Faust, Stefan Leiderer, and Matthew DiLorenzo. 2020.

Aid Management, Trust, and Development Policy Influence: New Evidence from a Survey of Public Sector Officials in Low-Income and Middle-Income Countries. Mimeo.

Meseguer, Covadonga. 2006. Learning and economic policy choices. European Journal of Political Economy 22 (1): 156-178.

Moll, P., and L. Smets. 2018. Is It the Journey That Matters? A Fresh Look at the Impact of World Bank Policy Lending. World Bank Policy Research Working Paper No. 8645. Washington, DC: World Bank.

Momani, Bessma. 2005. Recruiting and Diversifying IMF Technocrats. *Global Society* 19(2): 167-187.

Mosley, Paul, Jane Harrigan, and John Toye. 1995. Aid and Power: the World Bank and Policy Based Lending, Vol. 1. New York: Routledge.

Nelson, Stephen. 2014. Playing Favorites: How Shared Beliefs Shape the IMFs Lending Decisions. *International Organization* 68 (2): 297-328.

Parks, Bradley C., Zachary Rice, and Samantha Custer. 2015. The Marketplace of Ideas for Policy Change: Who do developing world leaders listen to and why? Williamsburg, VA: AidData at William Mary.

Parks, Bradley and Caroline Davis. 2019. When do governments trade domestic reforms for external rewards? Explaining policy responses to the Millennium Challenge Corporation's eligibility standards. *Governance* 32 (2): 349-367.

Pop-Eleches, Grigore. 2009. From Economic Crisis to Reform: IMF Programs in Latin American and Eastern Europe. Princeton, NJ; Princeton University Press.

Rajan, R. 2004. Why are structural reforms so difficult? Finance and Development 41(2): 5657

Ravallion, Martin. 2013. Knowledgeable bankers? The demand for research in World Bank operations. *Journal of Development Effectiveness* 5 (1): 1-29.

Ravid, Barak. 2007. Salam Fayyad: Everyones favorite Palestinian. *Haaretz*. April 1,2007.

Remmer, Karen. 1998. The Politics of Neoliberal Economic Reform in South America, 1980-1994. Studies in Comparative International Development 33(2): 3-29.

Robinson, Mark. 2007. The Politics of Successful Governance Reforms: Lessons of Design and Implementation. *Commonwealth and Comparative Politics* 45 (4): 521-548.

Saavedra, Pablo, Patricia Geli, and Peter Moll. 2015. Correlates of success in World Bank development policy lending. World Bank Policy Research Working Paper Series.

Samuel, Boris. 2014. Economic Calculations, Instability and (In)formalization of the State in Mauritania, 2003-2011. Canadian Journal of Development Studies 31 (1): 7796.

Sartori, Anne E. 2003, An estimator for some binary-outcome selection models without exclusion restrictions. *Political Analysi*, 11(2): 111-138.

Schelling, Thomas C. 1960. *The Strategy of Conflict*. Cambridge, MA: Harvard University Press

Smets, Lodewijk. 2020. Supporting Policy Reform from the Outside. *The World Bank Research Observer* 35 (1): 1943.

Smets, Lodewijk, Stephen Knack, and Nadia Molenaers. 2013. Political Ideology, Quality at Entry and the Success of Economic Reform Programs. *The Review of International Organizations* 8: 447-476.

Smets, Lodewijk and Stephen Knack. 2016. World Bank Lending and the Quality of Economic Policy. The Journal of Development Studies 52 (1): 72-91.

Smets, Lodewijk and Stephen Knack. 2018. World Bank Policy Lending and the Quality of Public Sector Governance. *Economic Development and Cultural Change* 67 (1): 29-54.

Tama, Jordan. 2013. Crises, commissions, and reform: the impact of blue-ribbon panels. Political Research Quarterly 67(1):152-164. Tansey, O. 2007. Process tracing and elite interviewing: A case for non-probability sampling. PS: Political Science and Politics 40(4): 765772.

Thrall, Nathan. 2010. Our Man in Palestine. The New York Review of Books.

USAID. 2015. Vision for Ending Extreme Poverty. Washington DC: USAID. Vreeland, James Raymond. 2003. *The IMF and Economic Development*. Cambridge, UK: Cambridge University Press.

Wane, Waly. 2004. The Quality of Foreign Aid Country Selectivity or Donors Incentives? World Bank Policy Research Working Paper 3325. Washington DC: World Bank.

Weyland Kurt. 2006. Bounded Rationality and Policy Diffusion: Social Sector Reform in Latin America. Princeton, NJ: Princeton University Press.

Weymouth, Stephen and J. Muir Macpherson. 2012. The Social Construction of Policy Reform: Economists and Trade Liberalization around the World. *International Interactions* 38 (5): 670-702.

Wolfensohn, James. 2008. Letter to the Meltzer Commission. 28 February 2000. Woods, Ngaire. 2006. The Globalisers: The IMF, The World Bank, and Their Borrowers. Ithaca, NY: Cornell University Press.

World Bank. 2004. Annual Review of Development Effectiveness 2003: The Effectiveness of Bank Support for Policy Reform. Washington, DC: World Bank.

World Bank. 2006. The World Bank's Economic and Sector Work and Technical Assistance: An Independent Evaluation Group (IEG) Review. Approach Paper. November 16, 2006. Washington DC: World Bank.

World Bank. 2007. Catalyzing the Future: An Inclusive and Sustainable Globalization. Annual Meeting Remarks by Robert B. Zoellick. 10 October 2007. Accessed at https://www.worldbank.org/en/news/speech/2007/10/10/an-inclusive-sustainable-globalization

World Bank. 2012. Public Financial Management Reforms in Post-Conflict Countries:

Synthesis Report. Washington DC: World Bank.

World Bank. 2013a. Financing for Development Post-2015. Washington DC: World Bank.

World Bank. 2013b. Program Document for a Proposed Second Institutional Strengthening for Social Inclusion (Second Institutional, Tax Administration, Social, and Investment) Development Policy Loan in the Amount of US\$400 Million. Washington DC: World Bank.

Supplementary Information for "How Does the World Bank Influence the Development Policy Priorities of Low-Income and Lower-Middle Income Countries?"

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## A Supplementary tables

**Table A1:** Crosswalk from Policy Domains in 2014 Reform Efforts Survey to World Bank Policy Clusters

Macroeconomic &	Human Development	Sustainable	Governance	Others
Structural	(HD)	Development (SD)	(GOV)	
Policy (MSP)				
•Macroeconomic	●Health	•Agriculture and Rural	•Decentralization	•Foreign
Management	•Education	Development	•Anti-corruption &	Policy
•Finance, Credit, &	•Family &	•Land	Transparency	No Particular
Banking	Gender	<ul> <li>Infrastructure</li> </ul>	Public Admin.	Policy Focus
•Trade	•Social	•Environment	Justice &	
Regulatory	Protection &	Protection	Security	
Environment	Welfare	•Energy &	•Tax	
•Customs	ulletLabor	Mining	•Public Expenditure	
$\bullet$ Investment			Management	

Table A2: Variable Descriptions

Variable Name	Variable Description	N	Mean	Std.dev	Min	Max
Outcome variables						
Influence	Respondent evaluation of the WB's agenda-setting influence	1244	3.5	1.33	0.0	5.0
Influence2	Respondent evaluation of the WB's policy design influence	1193	3.4	1.36	0.0	5.0
Helpfulness	Respondent evaluation of the WB's helpfulness during policy implementation	1099	3.7	1.09	0.0	5.0
Treatment variables						
lnaid_dpl_disb_pc_0_m_1p	Development policy loan (DPL) disbursements per capita (ln)	2314	-1.1	3.23	-5.4	4.2
lnaid_inv_disb_pc_0_m_1p	Investment loan disbursements per capita (ln)	2402	-0.3	5.74	-18.7	3.7
n_esw_m_1p	Number of economic and sector work (ESW) products	2612	0.7	1.01	0.0	12.0
dpl_proj_n_m_1p	Number of development policy loans (DPLs)	2612	0.3	0.46	0.0	2.5
pa_m_1p	Number of policy and institutional actions (prior actions)	2612	1.2	2.55	0.0	23.5
Country-level control variable	es					
lngdp_pc_1st	GDP per capita (ln)	2478	7.3	0.99	5.4	9.8
lngdp_pc_1st_2	GDP per capita (squared and ln)	2478	54.5	14.59	28.8	96.1
lnpop_1st	Population (ln)	2506	16.1	1.81	9.2	21.0
aid_gni_1st	Net ODA as percent of GNI	2445	11.3	21.08	-0.2	192.0
polity2_1st	Political regime type	2211	3.7	5.05	-10.0	10.0
left_1st	Dummy for left-wing government	2245	0.3	0.44	0.0	1.0

Table A3: Replication of Table 1 with Treatments and Controls Set to Mean Values Over Respondent Evaluation Periods

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)	(10)
lnaid_dpl_disb_pc_0_mean	-0.07**					0.01	-0.01	-0.08**		
•	(0.03)					(0.02)	(0.02)	(0.04)		
lnaid_inv_disb_pc_0_mean	,	-0.04				0.01	-0.04	$0.02^{'}$	-0.04	-0.04
-		(0.03)				(0.01)	(0.02)	(0.03)	(0.03)	(0.03)
n_esw_mean		` ′	0.18*			0.08	0.09	$0.17^{*}$	0.18*	0.20**
			(0.10)			(0.05)	(0.06)	(0.10)	(0.10)	(0.10)
dpl_proj_n_mean			, ,	0.32		, ,	,	, ,	0.32	, ,
				(0.21)					(0.21)	
pa_mean					0.02					0.04
					(0.04)					(0.04)
lngdp_pc_mean	-15.06**	-8.23	-10.76*	-9.98	-10.76*	0.76		-13.51**	-7.90	-8.82
	(6.40)	(6.51)	(6.25)	(6.39)	(6.24)	(0.77)	(4.37)	(6.51)	(6.68)	(6.53)
lngdp_pc_mean_2	1.13***	0.65	0.87**	0.83**	0.87**	-0.07	-0.13	0.98**	0.64	0.70
	(0.42)	(0.43)	(0.41)	(0.42)	(0.41)	(0.05)	(0.29)	(0.43)	(0.45)	(0.43)
lnpop_mean	-0.23	-0.38	-0.96	-1.39	-1.08	-0.13***	-1.21	0.42	-0.43	-0.11
	(1.74)	(1.85)	(1.72)	(1.69)	(1.69)	(0.04)	(1.09)	(1.89)	(1.88)	(1.90)
aid_gni_mean	-0.01	-0.00	-0.00	-0.00	-0.00	-0.01	-0.00	-0.00	0.00	0.00
	(0.01)	(0.01)	(0.01)	(0.01)	(0.01)	(0.00)	(0.01)	(0.01)	(0.01)	(0.01)
polity2_mean	0.04	0.05	0.05	0.05	0.05	0.01	-0.00	0.02	0.05	0.04
	(0.04)	(0.04)	(0.04)	(0.04)	(0.04)	(0.01)	(0.03)	(0.04)	(0.04)	(0.04)
left_mean	-1.06***							-1.04***		
	(0.38)	(0.38)	(0.37)	(0.38)	(0.38)	(0.11)	(0.26)	(0.37)	(0.38)	(0.38)
Respondent-level controls	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Country-Policy Cluster Pair FEs		Yes	Yes	Yes	Yes	No	No	Yes	Yes	Yes
Country FEs	No	No	No	No	No	No	Yes	No	No	No
Policy Cluster FEs	No	No	No	No	No	Yes	No	No	No	No
Observations	708	715	741	741	741	695	817	695	715	715
BIC	3501	3607	3712	3727	3710	2707	3533	3440	3598	3600
AIC	2324	2400	2468	2474	2471	2435	2870	2282	2391	2393

**Table A4:** Replication of Table 2 with Treatments and Controls Set to Mean Values Over Respondent Evaluation Periods

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)	(10)
lnaid_dpl_disb_pc_0_mean	-0.01					0.02	-0.02	-0.03		
	(0.04)					(0.02)	(0.02)	(0.04)		
lnaid_inv_disb_pc_0_mean		0.09***				0.01	0.00	0.11***	0.08***	0.08***
		(0.03)				(0.01)	(0.03)	(0.03)	(0.03)	(0.03)
n_esw_mean			0.13			0.08	0.14**	0.14	0.13	0.15
			(0.11)			(0.05)	(0.06)	(0.11)	(0.11)	(0.11)
dpl_proj_n_mean				0.27					0.23	
				(0.20)					(0.21)	
pa_mean					0.02					0.02
					(0.04)					(0.04)
lngdp_pc_mean	-12.93	-10.52	-12.60	-12.22	-13.02	1.05	0.77	-12.41	-9.70	-10.36
	(8.26)	(8.91)	(8.20)	(8.37)	(8.20)	(0.81)	(5.06)	(8.75)	(8.97)	(8.80)
$lngdp\_pc\_mean\_2$	0.92*	0.71	0.90	0.88	0.93*	-0.09*	-0.04	0.83	0.67	0.71
	(0.55)	(0.59)	(0.55)	(0.56)	(0.54)	(0.06)	(0.33)	(0.58)	(0.60)	(0.59)
lnpop_mean	-2.14	-2.25	-2.18	-2.49	-2.22	-0.14***	-1.66	-1.73	-2.35	-2.11
	(1.95)	(2.12)	(1.95)	(1.93)	(1.94)	(0.04)	(1.16)	(2.09)	(2.13)	(2.14)
aid_gni_mean	-0.00	0.00	0.00	0.00	0.00	-0.00	0.00	0.00	0.00	0.00
	(0.01)	(0.01)	(0.01)	(0.01)	(0.01)	(0.00)	(0.00)	(0.01)	(0.01)	(0.01)
polity2_mean	-0.02	-0.03	-0.02	-0.02	-0.02	-0.00	-0.04	-0.04	-0.04	-0.04
	(0.04)	(0.04)	(0.04)	(0.04)	(0.04)	(0.01)	(0.04)	(0.04)	(0.04)	(0.04)
left_mean	-0.36	-0.35	-0.53	-0.44	-0.49	-0.09	-0.19	-0.35	-0.27	-0.31
	(0.37)	(0.38)	(0.37)	(0.38)	(0.38)	(0.10)	(0.26)	(0.37)	(0.38)	(0.38)
Respondent-level controls	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Country-Policy Cluster Pair FEs	Yes	Yes	Yes	Yes	Yes	No	No	Yes	Yes	Yes
Country FEs	No	No	No	No	No	No	Yes	No	No	No
Policy Cluster FEs	No	No	No	No	No	Yes	No	No	No	No
Observations	689	695	721	721	721	676	796	676	695	695
BIC	3426	3468	3616	3623	3631	2684	3454	3368	3476	3470
AIC	2279	2309	2407	2409	2413	2418	2794	2230	2308	2307

Table A5: Replication of Table 3 with Treatments and Controls Set to Mean Values Over Respondent Evaluation Periods

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)	(10)
lnaid_dpl_disb_pc_0_mean	-0.01	- ( )		( )		0.02	-0.02	-0.03	( )	
maid_dpi_disb_pc_0_mean	(0.04)					(0.02)	(0.03)	(0.04)		
lnaid_inv_disb_pc_0_mean	(0.04)	-0.01				0.02*	0.00	0.01	-0.01	-0.01
marami and percentage		(0.03)				(0.01)	(0.03)	(0.03)	(0.03)	(0.03)
n_esw_mean		()	0.17*			-0.01	$0.02^{'}$	0.13	0.12	0.14
			(0.10)			(0.05)	(0.05)	(0.10)	(0.10)	(0.10)
dpl_proj_n_mean			` ′	0.42**		` ′	` ′	` ′	0.35*	` ′
				(0.20)					(0.21)	
pa_mean					0.07**					0.07*
					(0.04)					(0.04)
lngdp_pc_mean	-2.20	-1.69	-1.34	0.52	-0.67	0.21	-2.11	-3.46	-0.52	-1.56
	(5.38)	(5.39)	(5.42)	(5.47)	(5.27)	(0.77)	(3.88)	(5.70)	(5.75)	(5.56)
lngdp_pc_mean_2	0.22	0.22	0.15	0.06	0.13	-0.03	0.27	0.33	0.15	0.22
	(0.37)	(0.37)	(0.37)	(0.38)	(0.36)	(0.05)	(0.26)	(0.39)	(0.40)	(0.38)
lnpop_mean	2.39	0.93	2.67	1.73	2.15		-2.35**	1.42	0.77	1.14
	(1.84)	(1.74)	(1.85)	(1.85)	(1.84)	(0.04)	(1.12)	(1.78)	(1.77)	(1.74)
aid_gni_mean	0.02	0.01	0.02	0.02	0.02	-0.00	-0.00	0.01	0.02	0.01
14.0	(0.01)	(0.01)	(0.01)	(0.01)	(0.01)	(0.00)	(0.01)	(0.01)	(0.01)	(0.01)
polity2_mean	0.08 $(0.05)$	0.09 $(0.06)$	0.08	0.09*	0.09	-0.00	0.02 $(0.04)$	0.07 $(0.05)$	0.08	0.08
left_mean			(0.05) $-1.07**$	(0.05)	(0.05) $-0.92**$	(0.01)	\	()	(0.05) $-0.91**$	(0.05)
leit_mean	(0.42)	(0.42)	(0.42)	(0.43)	(0.43)	(0.12)	(0.25)	(0.42)	(0.42)	(0.43)
Respondent-level controls	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Country-Policy Cluster Pair FE		Yes	Yes	Yes	Yes	No	No	Yes	Yes	Yes
Country FEs	No	No	No	No	No	No	Yes	No	No	No
Policy Cluster FEs	No	No	No	No	No	Yes	No	No	No	No
Observations	656	659	679	679	679	645	760	645	659	659
BIC	3086	3060	3192	3171	3158	2389	3135	3028	3074	3054
AIC	1995	1977	2053	2045	2042	2126	2500	1947	1978	1971

Table A6: Models that Control for Respondent Willingness to Engage in Policy Dialogue with World Bank

	(4)	(2)	(2)	(1)	( <del>-</del> )	(0)	(=)	(0)	(0)	(10)
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)	(10)
lnaid_dpl_disb_pc_0_m_1p	-0.06**					-0.01	-0.03	-0.06**		
	(0.03)					(0.02)	(0.02)	(0.03)		
lnaid_inv_disb_pc_0_m_1p	` ′	0.01				0.02	-0.11***	-0.07	-0.01	-0.00
		(0.04)				(0.01)	(0.04)	(0.04)	(0.04)	(0.04)
$n_esw_m_1p$			0.21**			0.08	0.06	0.22**	0.21**	0.23***
			(0.09)			(0.05)	(0.06)	(0.09)	(0.09)	(0.09)
dpl_proj_n_m_1p				0.30					0.30	
				(0.18)					(0.18)	
pa_m_1p					0.01					0.02
					(0.03)					(0.03)
$lngdp\_pc\_1st$	-13.98**	-11.76**	-11.58**	-11.11*	-11.23**	0.75	0.17	-16.25***	-12.51**	-12.87**
	(5.89)	(5.92)	(5.72)	(5.81)	(5.72)	(0.79)	(4.05)	(6.00)	(6.05)	(6.00)
$lngdp\_pc\_1st\_2$	1.04***	0.89**	0.91**	0.87**	0.88**	-0.07	0.04	1.18***	0.95**	0.97**
	(0.38)	(0.38)	(0.37)	(0.38)	(0.37)	(0.05)	(0.27)	(0.39)	(0.40)	(0.39)
$lnpop_1st$	0.29	-0.09	-0.01	-0.61	-0.36	-0.14***	-0.77	1.34	0.22	0.50
	(1.61)	(1.70)	(1.62)	(1.60)	(1.59)	(0.04)	(1.03)	(1.76)	(1.77)	(1.76)
aid_gni_1st	-0.01	-0.01	-0.01	-0.01	-0.01	-0.00	-0.00	-0.01	-0.01	-0.01
	(0.01)	(0.01)	(0.01)	(0.01)	(0.01)	(0.00)	(0.00)	(0.01)	(0.01)	(0.01)
polity2_1st	-0.01	-0.00	-0.01	-0.00	0.00	0.01	-0.02	-0.02	-0.02	-0.02
	(0.04)	(0.04)	(0.04)	(0.04)	(0.04)	(0.01)	(0.03)	(0.04)	(0.04)	(0.04)
left_1st	-0.59*	-0.54	-0.67**	-0.56*	-0.65**	-0.17	-0.17	-0.56	-0.43	-0.49
	(0.33)	(0.33)	(0.33)	(0.31)	(0.32)	(0.10)	(0.22)	(0.35)	(0.34)	(0.35)
freq_comm	0.04	0.05	0.06	0.08	0.08	0.09*	0.09	0.00	0.04	0.03
	(0.08)	(0.08)	(0.08)	(0.08)	(0.08)	(0.05)	(0.06)	(0.08)	(0.08)	(0.08)
Respondent-level controls	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Country-Policy Cluster Pair FEs		Yes	Yes	Yes	Yes	No	No	Yes	Yes	Yes
Country FEs	No	No	No	No	No	No	Yes	No	No	No
Policy Cluster FEs	No	No	No	No	No	Yes	No	No	No	No
Observations	683	688	715	715	715	669	784	669	688	688
BIC	3408	3461	3623	3563	3586	2633	3403	3295	3447	3476
AIC	2258	2304	2389	2374	2384	2358	2750	2196	2291	2302
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Table A7: Models that Control for Respondent Demand for Reform Advice from World Bank

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)	(10)
lnaid_dpl_disb_pc_0_m_1p	-0.07**					-0.01	-0.03	-0.07**		
	(0.03)					(0.02)	(0.02)	(0.03)		
$lnaid_inv_disb_pc_0_m_1p$		0.02				0.02	-0.10**	-0.05	0.01	0.01
		(0.04)				(0.01)	(0.04)	(0.04)	(0.04)	(0.04)
$n_esw_m_1p$			0.24***			0.07	0.07	0.24***	0.24***	0.25***
			(0.09)			(0.05)	(0.06)	(0.09)	(0.09)	(0.09)
dpl_proj_n_m_1p				0.26					0.25	
				(0.19)					(0.19)	
pa_m_1p					0.00					0.02
					(0.03)					(0.03)
lngdp_pc_1st	-12.58**			-9.44	-9.39	0.77	0.64	-14.96**		
	(6.02)	(6.14)	(5.90)	(5.98)	(5.88)	(0.82)	(4.21)	(6.22)	(6.27)	(6.22)
$lngdp\_pc\_1st\_2$	0.94**	0.78**	0.80**	0.75*	0.75**	-0.07	0.02	1.08***	0.86**	0.87**
	(0.39)	(0.40)	(0.38)	(0.39)	(0.38)	(0.06)	(0.28)	(0.40)	(0.41)	(0.40)
lnpop_1st	0.02	-0.44	-0.26	-0.94	-0.74	-0.15***	-1.02	1.18	0.04	0.27
	(1.62)	(1.74)	(1.65)	(1.63)	(1.61)	(0.04)	(1.05)	(1.79)	(1.81)	(1.80)
aid_gni_1st	-0.01	-0.00	-0.00	-0.00	-0.00	-0.00	-0.00	-0.01	-0.00	-0.00
	(0.01)	(0.01)	(0.01)	(0.01)	(0.01)	(0.00)	(0.01)	(0.01)	(0.01)	(0.01)
polity2_1st	-0.01	-0.00	-0.01	-0.00	0.00	0.02*	-0.03	-0.02	-0.02	-0.02
1.6.1.	(0.04)	(0.04)	(0.04)	(0.04)	(0.04)	(0.01)	(0.03)	(0.04)	(0.04)	(0.04)
left_1st	-0.71**	-0.66**			-0.70**		-0.16	-0.71**	-0.58*	-0.63*
1 1 6 1 .	(0.33)	(0.33)	(0.33)	(0.32)	(0.32)	(0.10)	(0.22)	(0.35)	(0.34)	(0.35)
demand_reform_advice	0.07	0.08	0.07	0.08	0.08	0.05	0.03	0.06	0.07	0.07
D 1 (1 1 (1	(0.05)	(0.05)	(0.05)	(0.05)	(0.05)	(0.03)	(0.04)	(0.05)	(0.05)	(0.05)
Respondent-level controls	$\begin{array}{c} { m Yes} \\ { m Yes} \end{array}$	Yes Yes	Yes Yes	Yes Yes	Yes	Yes No	Yes No	$\begin{array}{c} { m Yes} \\ { m Yes} \end{array}$	Yes Yes	Yes Yes
Country-Policy Cluster Pair FEs					Yes					
Country FEs	No	No	No	No	No	No	Yes	No	No	No
Policy Cluster FEs	No	No	No	No	No	Yes	No	No	No	No
Observations	666	671	697	697	697	652	759	652	671	671
BIC	3350	3372	3483	3472	3501	2549	3284	3214	3345	3366
AIC	2194	2231	2292	2294	2305	2276	2641	2125	2213	2221

Table A8: Heckman Sample Selection Model

		(1)
	Outcome stage	Selection stage
n_esw_m_1p	0.18**	0.01
	(0.07)	(0.12)
lngdp_pc_1st	-7.04	-8.65
	(4.10)	(6.62)
lngdp_pc_1st_2	0.59*	0.35
	(0.27)	(0.43)
lnpop_1st	-0.32	3.64
	(1.26)	(1.88)
aid_gni_1st	-0.00	-0.01
	(0.01)	(0.01)
polity2_1st	-0.01	$0.02^{'}$
	(0.03)	(0.04)
left_1st	-0.45	$-0.55^{\circ}$
	(0.23)	(0.32)
number_org	,	0.24***
<u> </u>		(0.02)
Country-Policy Cluster Pair FEs	Yes	Yes
Respondent-level controls	Yes	Yes
Observations	1164	
Censored	445	
Rho	0.02	

Table A9: Placebo Tests

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)	(10)
lnaid_dpl_disb_pc_0_m_1p	-0.05					-0.00	-0.04	-0.04		
	(0.04)					(0.02)	(0.03)	(0.04)		
lnaid_inv_disb_pc_0_m_1p		-0.17***				-0.02	-0.10***	-0.15***	-0.17***	-0.17***
		(0.05)				(0.02)	(0.03)	(0.05)	(0.05)	(0.05)
$n_esw_m_1p$			0.01			-0.01	-0.05	0.02	0.02	0.04
			(0.12)			(0.04)	(0.06)	(0.12)	(0.12)	(0.12)
dpl_proj_n_m_1p				0.07					0.13	
				(0.22)					(0.23)	
$pa_m_1p$					0.03					0.04
					(0.04)					(0.04)
$lngdp_pc_1st$	-7.88	-2.78	-4.26	-4.18	-4.33	1.00	-0.49	-6.12	-2.70	-2.87
	(8.38)	(7.33)	(7.24)	(7.24)	(7.14)	(0.90)	(5.13)	(8.40)	(7.30)	(7.23)
$lngdp_pc_1st_2$	0.47	0.11	0.23	0.23	0.24	-0.08	-0.01	0.34	0.11	0.12
	(0.57)	(0.50)	(0.49)	(0.49)	(0.49)	(0.06)	(0.34)	(0.58)	(0.50)	(0.49)
lnpop_1st	0.93	0.82	0.36	0.27	0.33	-0.07*	0.76	1.24	0.74	0.91
	(1.77)	(1.72)	(1.70)	(1.72)	(1.69)	(0.04)	(1.12)	(1.81)	(1.77)	(1.75)
aid_gni_1st	0.01**	0.01**					0.01*	0.01**	0.01**	0.01**
	(0.00)	(0.00)	(0.00)	(0.00)	(0.00)	(0.00)	(0.00)	(0.00)	(0.00)	(0.00)
polity2_1st	0.07	0.09	0.08	0.08	0.08	0.03**	0.06	0.09	0.09	0.09
	(0.06)	(0.06)	(0.06)	(0.06)	(0.06)	(0.01)	(0.04)	(0.06)	(0.06)	(0.07)
left_1st	-0.62	-0.61	-0.67	-0.65	-0.60	0.03	-0.16	-0.65	-0.57	-0.50
	(0.51)	(0.51)	(0.49)	(0.49)	(0.49)	(0.11)	(0.28)	(0.52)	(0.51)	(0.52)
Respondent-level controls	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Country-Policy Cluster Pair FEs		Yes	Yes	Yes	Yes	No	No	Yes	Yes	Yes
Country FEs	No	No	No	No	No	No	Yes	No	No	No
Policy Cluster FEs	No	No	No	No	No	Yes	No	No	No	No
Observations	545	549	567	567	567	536	635	536	549	549
BIC	2862	2610	2910	2936	2910	2313	2994	2584	2622	2614
AIC	1946	1864	1995	2003	1994	2056	2383	1834	1868	1865

**Table A10:** Replication of Table 1 with Dependent Variable that Measures the Agenda-Setting Influence of the World Bank's Core ESW Diagnostic Products

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)	(10)
lnaid_dpl_disb_pc_0_m_1p	-0.05					0.02	-0.03	-0.04		
	(0.05)					(0.02)	(0.03)	(0.05)		
$lnaid_inv_disb_pc_0_m_1p$		0.02				-0.01	0.10	-0.07	0.01	0.00
		(0.12)				(0.01)	(0.08)	(0.11)	(0.12)	(0.12)
$n_esw_m_1p$			0.23**			0.04		0.27**	0.21*	0.22**
			(0.11)			(0.04)	(0.07)	(0.11)	(0.11)	(0.11)
dpl_proj_n_m_1p				0.21					0.16	
				(0.24)					(0.23)	
pa_m_1p					0.04					0.05
					(0.04)					(0.04)
$lngdp_pc_1st$	-0.59	3.51	-1.41	0.61	0.48	1.29	1.42	1.99	3.07	3.30
	\ /	(6.09)	(6.54)	(6.37)	. ,	(0.88)	(4.46)	(6.84)	(6.52)	(6.67)
$lngdp_pc_1st_2$	-0.03		0.03	-0.10	-0.10	-0.10	-0.08	-0.13	-0.21	-0.22
	\ /	(0.43)	(0.45)	. ,	(0.45)	(0.06)	(0.30)	(0.47)	(0.46)	(0.47)
lnpop_1st		-3.50	-0.27			-0.09*	-	-2.77	-2.74	-2.77
	'	(2.47)	(2.41)			(0.05)		(2.57)	(2.46)	(2.45)
aid_gni_1st	-0.01		-0.01			0.01**		-0.01	-0.01	-0.01
	'	(0.01)	(0.01)	\	,	(0.00)	\ /	(0.01)	(0.01)	(0.01)
polity2_1st		-0.09	-0.05		-0.04		-	-0.12*	-0.11	-0.12
	. ,	(0.07)	(0.06)		(0.06)	(0.01)		( )	(0.07)	(0.07)
left_1st	0.06	0.29	0.19	0.22	0.25	0.03	0.24	0.23	0.35	0.42
	(0.48)	(0.49)	(0.48)	(0.48)		(0.11)	(0.25)	(0.49)	(0.49)	(0.49)
Respondent-level controls	Yes									
Country-Policy Cluster Pair FEs	Yes	Yes	Yes	Yes	Yes	No	No	Yes	Yes	Yes
Country FEs	No	No	No	No	No	No	Yes	No	No	No
Policy Cluster FEs	No	No	No	No	No	Yes	No	No	No	No
Observations	466	469	486	486	486	456	544	456	469	469
BIC	2447	2477	2593	2561	2574	1950	2616	2378	2471	2494
AIC	1610	1635	1701	1695	1699	1711	2048	1554	1628	1635

Table A11: Replication of Table 1 with Exponentiated Coefficients Expressed as Odds Ratios

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)	(10)
lnaid_dpl_disb_pc_0_m_1p	0.94**					0.99	0.97	0.94**		
	(0.03)					(0.02)	(0.02)	(0.03)		
lnaid_inv_disb_pc_0_m_1p		0.99				1.02	0.90***	0.94	0.97	0.98
		(0.04)				(0.01)	(0.04)	(0.04)	(0.04)	(0.04)
$n_esw_m_1p$			1.23**			1.08*	1.06	1.24**	1.24**	1.25***
			(0.10)			(0.05)	(0.06)	(0.11)	(0.10)	(0.11)
dpl_proj_n_m_1p				1.38*					1.40*	
				(0.25)					(0.26)	
pa_m_1p					1.01					1.03
					(0.03)					(0.03)
$lngdp_pc_1st$	0.00**	0.00*	0.00*	0.00*	0.00*	1.91	0.76	0.00***	0.00*	0.00**
	(0.00)	(0.00)	(0.00)	(0.00)	(0.00)	(1.51)	(3.07)	(0.00)	(0.00)	(0.00)
$lngdp\_pc\_1st\_2$	2.88***	2.30**	2.35**	2.27**	2.29**	0.94	1.08	3.25***	2.44**	2.49**
	(1.09)	(0.86)	(0.85)	(0.84)	(0.82)	(0.05)	(0.29)	(1.26)	(0.94)	(0.95)
lnpop_1st	1.24	0.74	0.76	0.41	0.54	0.86***	0.42	3.49	0.99	1.36
	(2.00)	(1.26)	(1.23)	(0.66)	(0.85)	(0.04)	(0.44)	(6.17)	(1.75)	(2.39)
aid_gni_1st	0.99	0.99	0.99	0.99	0.99	1.00	1.00	0.99	1.00	1.00
	(0.01)	(0.01)	(0.01)	(0.01)	(0.01)	(0.00)	(0.00)	(0.01)	(0.01)	(0.01)
polity2_1st	0.99	1.00	0.99	1.00	1.00	1.01	0.98	0.98	0.98	0.98
	(0.04)	(0.04)	(0.04)	(0.04)	(0.04)	(0.01)	(0.03)	(0.04)	(0.04)	(0.04)
left_1st	0.56*	0.59	0.52**	0.58*	0.53**	0.85	0.87	0.57	0.66	0.63
	(0.18)	(0.20)	(0.17)	(0.18)	(0.17)	(0.09)	(0.19)	(0.20)	(0.22)	(0.22)
Respondent-level controls	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Country-Policy Cluster Pair FEs	Yes	Yes	Yes	Yes	Yes	No	No	Yes	Yes	Yes
Country FEs	No	No	No	No	No	No	Yes	No	No	No
Policy Cluster FEs	No	No	No	No	No	Yes	No	No	No	No
Observations	686	692	719	719	719	672	787	672	692	692
BIC	3500	3480	3610	3621	3625	2636	3400	3322	3465	3495
AIC	2290	2327	2401	2408	2412	2366	2755	2208	2312	2324

## B Description of the Sampling Frame Construction and the Application of Inverse-Probability Weights

While the true population of development policymakers and practitioners in low-income and lower-middle income countries is for all intents and purposes unobservable, we took painstaking efforts to identify a well-defined and observable population of interest (see Parks et al. 2015). We define this population of interest as including those individuals with direct knowledge of how government policies and programs were prioritized, designed, and implemented in low- and lower-middle income countries between 2004 and 2013.

In recognition of the need for cross-country comparability and the fact that every government consists of a unique set of institutions and leadership positions, we identified our population of interest by first mapping country-specific public sector institutions (and leadership positions within those institutions) back to an ideal-typical developing country government. This ideal-typical government consisted of 33 institution types, such as a Ministry of Finance, a Supreme Audit Institution, and a National Statistical Office. We then identified functionally equivalent leadership positions within these institutions, and the specific individuals who held these positions between 2004 and 2013. For the four additional stakeholder groups that we included in our sampling frame (in-country development partners, domestic civil society and non-governmental organizations, private sector associations, and independent experts), we undertook a similar process of first mapping country-specific institutions and positions, and then identifying the individuals who held those positions between 2004 and 2013. Identifying functional equivalents at the institution- and leadership position-level resulted in a sampling frame of 54,990 individuals that enables comparison across countries. By clearly defining a population of interest and constructing a master sampling frame that is stratified by country, stakeholder group, and institution type, we also managed to overcome one of the most vexing challenges associated with elite surveys: the absence of detailed demographic data and the inability to assess the representativeness of findings at various levels.

To construct non-response weights, we estimated a multivariate logistic regression to calculate the predicted response rate for each member of the sampling frame. We then took the following steps to calculate non-response weights for the 6,731 participants in the 2014 Reform Efforts Survey. First, to select a set of variables to be included in the model, we followed other major surveys by eliminating variables that turn out to be insignificant (p > 0.30) and keeping the variables that significantly improve the model fit. The final set of variables included in the logistic regression are sex, institutional type, country, and stakeholder group, which all turn out to be statistically significant (p < 0.05). Then, we computed the predicted rate of response based on the estimated logistic regression for each member of the sampling frame and took its inverse to arrive at non-response weights, which were then re-scaled to add up to the total number of respondents. To eliminate extreme weights, we followed other surveys in replacing all weights above 2.5 with 2.5, which affected only 66 respondents out of 6,731 respondents.