Trust and Contracts: Empirical Evidence*

Francesco D'Acunto[†], Jin Xie[‡], and Jiaquan Yao[§] November 2020

Abstract

Trust between parties should drive the design of contracts: if parties did not trust each others' reaction to unplanned events, they might agree to pay higher costs of negotiation to complete contracts. Using a unique sample of U.S. principal-agent consulting contracts and a negative shock to trust between parties staggered across space and over time, we find that lower trust increases contract completeness. Not only contract complexity but also the verifiable states of the world contracts cover increase after a drop in trust. The results hold for several text-analysis-based measures of completeness and do not arise when agents are also principals (shareholders) or in other falsification tests. Non-compete agreements, confidentiality and indemnification clauses, and restrictions to agents' actions are more likely to be added to contracts signed in the same locations, same industries, and same years after a negative shock to trust.

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[†]Carroll School of Management, Boston College. e-Mail: dacuntof@bc.edu

[‡]The Chinese University of Hong Kong. e-Mail: xiejin@cuhk.edu.hk

[§]School of Management, Jinan University. e-Mail: jiaquanyao@gmail.com.

I Introduction

The design of principal-agent contracts shapes economic activity as studied in disparate fields such as labor economics, industrial organization, political economy, and corporate finance. In particular, the causes and consequences of contract incompleteness—the fact that parties do not to contract on all verifiable contingencies—have been an important focus of contract theory (e.g., see Hart and Moore (1988); Maskin and Tirole (1999); Hart and Moore (1999)). Contract incompleteness imposes renegotiation costs (Segal (1999)), might induce costly access to courts (Lerner and Schoar (2005)), delay economic activity, and limit financial flexibility (Tirole (2006)). At the same time, the flexibility of contract incompleteness can insure against enforcement risk (Gennaioli (2013)). Incompleteness might also be inevitable due to parties' limited cognition (Tirole (2009)). Despite a large theoretical literature, our empirical understanding of why contracts are incomplete is still in its infancy (Chiappori and Salanié (2003); Eigen (2012); Ganglmair and Wardlaw (2017); Gennaioli and Ponzetto (2017); Iyer and Schoar (2015); Buchak (2016); Jeffers and Lee (2019); Gennaioli, La Porta, Lopez-de Silanes, and Shleifer (2020)).

The extent of trust among contracting parties—the belief that the counterpart would not engage in predatory conduct if unplanned states occurred after the contract is signed (Eggleston, Posner, and Zeckhauser (2000); Gennaioli, La Porta, Lopez-de Silanes, and Shleifer (2020); Guiso and Makarin (2020))—seems a natural potential driver of contract completeness. If a principal trusts the prospective agent, both parties might prefer to not engage in endless negotiations to plan for contingencies such as the stealing of confidential information. To the contrary, if the principal does not trust the agent fully, she might insist to negotiate confidentiality clauses, noncompete agreements, or indemnification clauses, among others. Because courts can verify most of such contingencies, a distrustful principal might increase the extent of contract completeness by negotiating more clauses.

This paper aims to test empirically whether trust among parties affects contract completeness. Such test faces two major challenges. The first challenge relates to measurement: the econometrician needs to observe a large, representative, and homogeneous sample of principal-agent contracts in which the extent of completeness

can be defined and measured meaningfully. The second challenge is isolating a quasi-exogenous source of variation in the trust between prospective principals and agents.¹

We tackle these challenges by introducing novel data and exploiting a quasi-exogenous shock to trust among parties in the context of consulting contracts between a principal (firm's shareholders/management) and an agent (consultant).² Our sample consists of all consulting agreements US public firms report to the Securities and Exchange Commission (SEC) through mandatory filings.³ For each contract, we extract the principal and agent identities, whether the agent is a firm or an individual, the contracting date, the state of business, duration, payment amount and type, and the full text of the contract. Figure A.1 is an example of a contract in our sample.

To measure contract completeness, we start by creating a set of empirical proxies based on the topics and length of contract clauses using textual analysis techniques, which we discuss in detail in Section III. Topics and length are meaningful determinants of completeness in our setting, because consulting contract clauses, contrary to narrative texts like news, display standardized structure and semantics. Adding clauses almost always means that the parties plan on additional contingencies.

This first analysis provides a homogeneous and general assessment of contracts across space and over time, but does not allow us to disentangle the notions of completeness, complexity, and vagueness of contracts (Gennaioli and Ponzetto (2017)).⁴ As a second approach, we thus analyze the content of the clauses that are more likely to be added to contracts in low-trust environments. We find that they include non-compete agreements, confidentiality and indemnification clauses, and other restrictions to agents' actions.

To tackle the second empirical challenge—finding a negative shock to trust between

¹Whereas these challenges could be overcome through the design of experiments, the laboratory environment would not allow for a high-stake contracting setting based on the choices of expert decision-makers.

²We abstract from the agency problem between the principal and management, assuming that managerial interests are fully aligned with those of shareholders when negotiating consulting contracts. Below, we discuss why this assumption is meaningful in our institutional setting.

³Contracts are filed through 8-K, 10-K, and 10-Q SEC filings. Section III.A. describes the steps we use to construct the sample of consulting contracts.

⁴In Section III, we also discuss our mapping of the concept of completeness to the data as well as the relationship between complexity, completeness, and vagueness in our setting.

Trust in Big Businesses' Practices

Contract Completeness (200-Topic Measure)

8

1998 2000 2002 2004 2006 2008 2010

Contract Completeness (200-Topic Measure)

1998 2000 2002 2004 2006 2008 2010

Figure 1: Trust and Topics Covered in US Consulting Contracts

The left panel reports the average extent of trust in big businesses by a representative US population based on a scale from 1 (low trust) to 4 (high trust) surveyed yearly between 1998 and 2010. The right panel reports the average number of topics in our sample of consulting contracts signed in the United States between 1998 and 2010 based on SEC reports by US listed firms as well as private firms that issue public debt instruments. We describe in detail the definition and construction of this measure in section III.

parties—we exploit the Arthur Andersen LLP (AA) scandal in 2002, which arguably represented the largest scandal in US accounting auditing and consulting. AA was one of the five largest auditors worldwide (*Big Five*) up until 2002. In 2002, AA was found guilty of obstruction of justice for destroying hard evidence about its audits of Enron. AA surrendered its CPA license in August 2002. As Giannetti and Wang (2016) document and as we replicate below, small shareholders' (principals') trust in big business practices, which include consulting activities (agents), dropped substantially after the AA scandal.

The left panel of Figure 1 portrays the drop in trust in big business practices among college-educated US households—who are shareholders of public firms through their stock holdings—based on the Gallup Trust Survey. Shareholders' trust in both management and external consultants dropped, because the AA scandal involved collusion of AA employees with Enron's management. Giannetti and Wang (2016) study the negative effects of this shock on shareholders' trust towards managers as captured by the decision to sell stakes in listed firms. Our paper instead focuses on those shareholders who do not liquidate their holdings and hence by revealed preference trust managers enough to keep delegating managers to negotiate contracts on their behalf.

The right panel of Figure 1 shows that contract completeness for consulting contracts has increased throughout the United States after 2002. This raw-data time-series fact is a strong feature of our data and holds across several measures of contract completeness (see Figure 2). We show that changes in the endogenous matching of parties cannot explain this fact, because the characteristics of firms and consultants did not change after 2002.

Although interesting, the evidence in Figure 1 cannot be interpret causally. For instance, contemporaneous time-varying shocks might explain the aggregate dynamics of both trust and contract completeness. A prime example is the implementation of the Sarbanes-Oxley Act (SOX) after 2002.⁵ To overcome these issues, we exploit the fact that a higher state-level share of public companies that were AA's clients in 2000—and hence a higher fraction of local households/small shareholders exposed to the AA scandal—is associated with a larger drop in trust in big businesses practices across US states. We exploit this differential pre-scandal exposure to the shock across states to propose a difference-in-differences strategy. Our strategy compares the completeness of contracts signed on behalf of shareholders in states in which more or fewer shareholders were exposed to the shock, before and after the shock. This strategy helps us to exclude that nationwide shocks, such as changing financial regulation like SOX or business cycle shocks, might explain our results. Methodologically, this strategy builds on a literature that exploits the spatial variation of trust within countries to disentangle the effects of trust from those of other national formal and informal institutions.⁶

Our difference-in-differences analysis confirms that lower trust among contracting parties increases contract completeness. After 2002, our preferred measure of completeness—the number of topical areas contracts cover—increased by 10% more in states with a higher share of AA clients relative to other states. Results are similar for several measures of completeness and across robustness tests.

To validate our baseline results, we perform a set of falsification tests. We show that

 $^{^5}$ Below, we discuss a set of specific tests and arguments that rule out the implementation of SOX as a driver of our results.

⁶See, among others, Guiso, Sapienza, and Zingales (2004); Guiso, Sapienza, and Zingales (2008); Hilary and Huang (2016); Buggle (2016); Gurun, Stoffman, and Yonker (2017); D'Acunto (2019b); Pierce and Snyder (2017); D'Acunto, Prokopczuk, and Weber (2018); Levine, Lin, and Xie (2017); Depetris-Chauvin, Durante, and Campante (2020); and D'Acunto et al. (2020).

the share of state-level firms that were clients of *other* Big Five accounting consulting companies does not explain trust in business nor predicts higher contract completeness. This test rules out that any systematic shock to the consulting services industry or other state-year unobserved shocks might drive our results. We also show that the completeness of contracts signed with firm insiders, such as C-suite managers, who are also principals through their shareholdings, does not change over time.

A concern is our strategy might capture a US-wide linear increase in contract completeness over time, paired with the fact that AA clients in 2000 needed to sign new contracts after AA's demise. More broadly, firms that were directly clients of AA might have faced other shocks, above and beyond the shock to local shareholders' trust in big businesses practices, and such other shocks might have pushed former AA clients to sign different contracts after 2002. We dismiss this alternative explanation in a robustness test that excludes all direct AA clients in 2000 from the analysis, which barely changes our results. This test suggests that the change in contracts is *not* driven by former AA client firms, but instead contracting practices changed on average also for non-AA client firms headquartered in the states in which the AA scandal was more salient (e.g., see Giannetti and Wang (2016); Gurun, Stoffman, and Yonker (2017); and D'Acunto, Weber, and Xie (2019)).

Moreover, the AA scandal might have also affected other beliefs, which in turn drove higher contract completeness, such as trust in the judicial system or in banks. For both of these forms of trust, which we observe directly and are elicited at the same time and on the same college-educated households as the trust in big business practices, we find no changes after 2002 and/or across states.

Another potential concern is that, after the AA scandal, more firms started to disclose contracts, and such previously undisclosed contracts were more complete. Nation-wide new disclosure requirements such as those in SOX are dismissed by our difference-in-differences strategy. Against the possibility of state-specific unobserved shocks, we find that the average number of disclosed contracts did not increase differentially after 2002 and across states with a higher or lower exposure to the AA scandal.

Still, firms in higher-AA-share states might have signed more contracts after 2002

and such contracts might have been more complete. In this case, our effects should have been only temporary: Firms in other states would have also needed to sign new contracts once the existing ones expired naturally. Instead, the effects we document do not revert throughout our sample period.

Our results so far use measures of contract completeness based on textual analysis. These measures are homogeneous across contracts and allow summarizing in one variable a multi-faceted dimension—the completeness of disparate contract clauses. At the same time, to better link our results to contract completeness, we need to assess the specific content of the clauses that tend to be added to contracts in times in which trust between parties drops. We dedicate the last part of our paper to this analysis.

We find that, after 2002 and especially in states whose small shareholders were more exposed to the AA scandal, contracts were more likely to include non-compete agreements and clauses on the confidentiality of trade secrets and information, on the restrictions to agents' ability to dispose of equity compensation (stock grants and stock options), and on the procedures for the unilateral termination of the contract as well as for requesting amendments to the contract. We also find that clauses on indemnification and the liability of agents appear more often in contracts even though this result is not statistically significant in the difference-in-differences analysis. Overall, all these clauses appear to refer to verifiable future contingencies and support our interpretation that completeness might increase due to principals' distrust in agents.

In line with the literature in law & economics that discusses the variation in the enforcement of non-compete agreements across US states (e.g. see Garmaise (2011); Jeffers (2018); Starr (2019)), we also find that non-compete agreements are more likely to be added to contracts, but only to contracts signed in US states more exposed to the AA scandal in which they can be enforced. This result rules out that higher contract completeness is merely driven by the use of different contract templates across space and over time. Rather, the parties appear to pay attention to the viability of the specific clauses they negotiate and they add to contracts after the drop in trust.

The last question we ask is whether the effects of the drop in trust on contract completeness are temporary or long-lived. In line with the notion that negative shocks to trust are harder to overcome than positive shocks (Schweitzer et al. (2006)), we do not detect any reversal of the drop in trust after 2002 or of the increase in contract completeness throughout our sample period. If anything, the effects build up over the first 5 years after the shock. The stickiness of contracts in place at the time of the shock likely explains these dynamics.

Ideally, we would assess the effects of trust on contracting within contract relationships over time, because trust might build up through repeated interactions (Malhotra and Murnighan (2002); Lumineau (2017)). Unfortunately, we only have a small amount of contracts signed by the same firm and the same consulting party at different points in time once we exclude mere deadline updates.

Finally, whether the effects of distrust are triggered by shareholders' explicit pressure on managers to complete the contracts signed with (untrustworthy) agents or whether managers complete contracts to insure themselves against possible actions of shareholders after a future damage caused by agents—actions that were foreseeable before and after the drop in trust and that managers could have provided for in contracts also before the drop—cannot be disentangled in our analysis and represents an interesting follow-up question for future research.

II Conceptual Framework and Data

The conceptual framework that drives our empirical analysis relies on the notion of functionally complete contract, that is, a contract to which parties cannot add any contingency because either the occurrence of such contingency would not be verifiable ex post, or it would be too costly to describe the state of the world under which such contingency arises (Eggleston, Posner, and Zeckhauser, 2000). A functionally incomplete contract is thus a contract to which ex-post verifiable contingencies can be added.

Incomplete contracts can arise either because one or both parties lack the cognitive abilities needed to foresee and describe all potential future verifiable contingencies (Maskin and Tirole (1999); Tirole (2009)), or because of material transactions costs (Williamson (1985); Hart and Moore (1988)), or because the parties enjoy mutual benefits from

proceeding their contractual relationship in an incomplete framework (Crocker and Reynolds (1993); Halonen-Akatwijuka and Hart (2013)).

Incomplete contracts might impose severe costs on the parties. For example, the parties might engage in costly and inefficient arbitration or access to courts if an unplanned contingency arises (Anderlini, Felli, and Postlewaite (2011)). Moreover, the realization of unplanned events might impose deadweight losses if contracts are perceived as reference points, as long as the unplanned events cause at least one party to obtain less than what they were expecting (Hart and Moore (2008)). Incomplete contracts can also hinder agents from restricting their action space credibly under asymmetric information and moral hazard, which could reduce the resources agents can obtain from principals (for example, in the case of debt covenants in financing contracts, see Matvos (2013)).

At the same time, contracting parties might prefer incompleteness for at least two reasons. First, incomplete contracts provide an option value: They allow planning for verifiable future contingencies at a time in which less uncertainty exists about such contingencies, and agreeing on the terms might be easier (Hart and Moore, 1999). Moreover, because negotiating on contract clauses is costly, both parties might prefer to leave ex-post verifiable contingencies out of the contract if they deem such contingencies implausible (Hart and Moore (1988); Crocker and Reynolds (1993)).

Trust among bargaining parties might be a relevant mediator of the trade off between the costs and benefits of incomplete contracts (e.g., see Eigen (2012); Fehr et al. (1993); Fehr et al. (2007)). By trust we mean that each party believes the other would behave fairly under asymmetric information about potential future contingencies and in case an unplanned contingency arose during the relationship, and would not behave in a way that is inconsistent with the spirit of the contract (Eggleston et al. (2000)).

First, if trust among parties is low enough, parties might not engage in contracting at all. To the extent that we observe a signed contract, trust must have been high enough for the expected benefits of contracting to overcome the expected costs. Second, lower trust might *increase* contract completeness, because in a high-trust environment, both parties might prefer to avoid the costs of defining and negotiating ex-post verifiable clauses given that they believe that the other party would behave fairly even if a contingency not

planned for in the contract arose. Instead, if the principal's trust toward the prospective agent dropped, the principal might want to negotiate more clauses before the contract is signed and especially clauses that reduced the agents' ability to produce damage to the principal during the contract relationship.

Based on these arguments, in the rest of the paper we discuss our proposed measures and empirical strategy to test whether lower trust increases contract completeness.

III Measuring Contract Completeness

In this section, we first describe the construction of the novel sample of consulting contracts we use. We then discuss how we propose mapping and measuring contract features into the extent of contract completeness. As we discuss in Section III.B., the mapping of the theoretical concept of completeness into an empirical measure is not obvious and our baseline measure might capture at the same time contracts' completeness and complexity. For this reason, in Section VI we propose a complementary analysis that studies quantitatively and qualitatively the topics that are added to contracts after a negative shock to trust to better assess whether such topics might suggest higher contract completeness and not just higher complexity.

A. Constructing the Sample of Consulting Contracts

We draw our sample of consulting contracts from the material contracts US companies file with the US Securities and Exchange Commission (SEC) from 1994 to 2015.⁷ The firms whose contracts we observe are regulated by the SEC, and hence are either public firms or private firms that issue public debt instruments in the US.

Firms can file material contracts in three ways—under Exhibit 10 of 8-K forms or Exhibit 10 of the annual or quarterly financial reports (i.e., 10-K and 10-Q filings). Form 8-K is the "current report" companies are required to file to announce major events about which shareholders should be informed. Firms are required to file such form within 4 business days from the occurrence of the event. In the case of consulting contracts, the full

⁷Our sample stops in 2015 to avoid censoring when measuring contract renegotiation.

texts of such contracts are attached to Forms 8-K and made public. In the case of annual and quarterly financial reports, the full contracts are also attached to the form. The main difference between the reporting vehicle is the timing of the disclosure of information. If the firm chooses to disclose and make public the contract in an 8-K filing, the information is disseminated when the contract is signed. Under 10-K or 10-K filings, the information is public only at the end of the quarter or end of the fiscal year. Of course, firms might have several unobserved strategic motives when choosing the disclosure vehicle. For this reason, in all our multivariate analyses we control for the form of disclosure and we replicate out results separately for both types of reporting vehicles.⁸

To identify and have access to all consulting agreements, we obtain hyperlinks to the main Edgar webpages for all 8-K, 10-K (and 10-KSB), and 10-Q (and 10-QSB) filings and their amendments filed with the SEC between 1994 and 2015. To do so, we use an automated Python program to crawl the SEC's index files and download all hyperlinks related to these filings. We use the "List of Filings Exhibits" file in the SEC Analytics database to identify Exhibit 10 sections within each form, and then use a text parsing tool in Python to extract the corresponding 334988, 266198, and 304674 Exhibit 10 sections as attachments in 8-K, 10-K, and 10-Q filings.

To narrow the scope of our search to a sample consulting agreements, we identify the titles of all Exhibit 10 sections of each filing that include at least one of the following terms: "consulting", "consultant", "consultation", "advice", and "advisory". Each contract has a unique firm identifier (cik). In order to link contracts to the originating firm and hence match it to firm-level characteristics, we obtain the global company key (gvkey) from the "List of Filings Exhibits" file.

We check manually each contract to ensure that none of the following cases enters the sample: (i) amendments to contracts due to renegotiation, which would not represent full contracts and hence would bias our measures of completeness (we code the presence of renegotiations as a separate variable); (ii) duplicated contracts, which are identically

⁸We do not claim that the choice of reporting vehicle is in any way exogenous, but we show that as far as the completeness of contracts is concerned, in our difference-in-differences analysis the results do not change based on the endogenous choice of reporting vehicle.

 $^{^9\}mathrm{We}$ can share the Python script code for these steps upon request.

reported through more than one SEC form filing; (iii) contracts that do not include the year in which the agreement was signed, for which we would not be able to assign a treatment or control condition in our identification strategy; and (iv) contracts for which we cannot obtain the *gvkey* through the "List of Filings Exhibits", for which we would not know firm-level characteristics.

This procedure leaves us with 6,081 distinct consulting agreements, of which Figure A.1 reports and example. We exploit the richness of these data to extract several characteristics of both principals and agents using an automated process supplemented with manual checks. For principals, we obtain information about listing status, firm name, gvkey, filing date, contracting date, form filed with the SEC (8K, 10K, or 10Q), business state, state of incorporation, the Standard Industrial Classification (SIC), and the firm's headquarters zip code. For public firms, we use gvkey codes to obtain characteristics from the Compustat/CRSP database. For agents, we obtain the consultants' names, whether the consultant is a firm insider (previous CEO, previous director, or current employee), whether the consultant is an independent contractor or a firm, and the zip code associated with the consultant's residence.

As far as contract terms are concerned, we extract information on the effective dates of the contract, the contract's duration (in months), the amount of cash payment and frequency of pay, whether grants of stocks and options apply, whether the contract includes a non-compete clause, a confidentiality clause, the choice of state for governing laws, an arbitration clause, and the total and unique number of words and sentences.

B. Mapping Features into Contract Completeness

A major challenge to tackle our question is defining the mapping of the concept of contract completeness into a variable we can measure in the data. Ideally, we would be able to measure the number of contingencies the parties agree to include in the contract and whether these contingencies are verifiable. The number of contingencies captures the complexity of the contract, but higher complexity makes a contract more complete only if the additional contingencies are verifiable.

To conceptualize the difference between contract completeness and complexity,

consider a clause that we show tends to be added to contracts in low-trust environments—non-compete agreements, whereby the agent agrees to commit to not compete with the principal in the principals' areas of activity once the contractual relationship is over, for instance by luring principals' clients. Whether an agent engages in competition against the principal is verifiable, and hence adding a non-compete agreement to the contract increases its completeness as well as its complexity.

On the other end, consider the mode of agent's compensation. Typical modes include cash payments and/or equity incentives, such as stocks and stock options. Stock incentives align the interests of principals and agents, and are typically favored by principals to reduce moral hazard. At the same time, agents might worry that a distrustful principal engages in actions that temporarily reduce the value of the firm's equity so as to reduce the agent's compensation when the equity incentives can be cashed. The principal (shareholders) is presumably less interested in the short-term value of the firm's equity than the agent, who wants to obtain her remuneration without facing the risk of business if risk averse. Principals' intentions would be hard to assess without doubt. A risk-averse agent might thus prefer to obtain cash instead of equity incentives, both because the value of cash payments is not risky (as long as bankruptcy is unlikely) and because the fair value of cash payments is verifiable, whereas the fair value of equity incentives is not. In this case, whether the contract provides for equity incentives or cash payments would not change its complexity, but a contract that includes cash payments is more complete.

Based on these considerations, we propose two empirical approaches to measure contract completeness. The baseline approach is based on complexity, under the assumption that a more complex contract might weakly be more complete to the extent that at least one of the additional contingencies in the contract can be verifiable.

To corroborate that this approach captures completeness, and not just complexity, we also propose a second approach based on whether, keeping constant the complexity of clauses, a contract includes verifiable contingencies instead of unverifiable contingencies and hence is more complete despite not being more complex.

Both approaches build on the use of textual analysis in finance and accounting research, as pioneered by Hoberg and Phillips (2010), Hoberg and Phillips (2016) among

others and surveyed recently by Loughran and McDonald (2016) and Gentzkow et al. (2019).

C. Topic-Modeling Measures of Contract Completeness

Our first set of measures of contract completeness are based on the amounts of topics contracts cover. By construction, covering more topics means that the contract covers more future potential contingencies, and hence is more complete as long as at least one of the additional contingencies is verifiable. This property is especially true for consulting contracts, relative to prosaic texts of other forms of texts, because of the homogeneity and standardization of their structure.

The main challenge to count the number of topics covered in contracts is defining a consistent, coherent, and systematic definition of potential topics and methodology to assign groups of words to alternative topics. Manual coding is barely appropriate, because the detection of alternative topics might be subjective to the coder, it would be hard to guarantee homogeneity, and other issues Huang et al. (2018) discuss.

To tackle this challenge, we resort to textual-analysis techniques and build on the Latent Dirichlet Allocation (LDA) first developed by Blei et al. (2003). The LDA reduces the dimensionality of linguistic data from words to topics, based on word co-occurrences within a same document. LDA uses a statistical generative model to imitate how a human being writes a contract. In particular, LDA assumes that each word in a contract is generated in two steps. In the first step, LDA assumes that each contract has its own topic distribution. A topic is randomly drawn based on the contract's topic distribution. In the second step, LDA assumes each topic has its own word distribution. A word is randomly drawn from the word distribution of the topic selected in the previous step. LDA repeats these two steps word by word to generate a contract. The algorithm discovers the topic distribution for each contract and the word distribution of each topic iteratively, by fitting this two-step generative model to the observed words in the contracts until it finds the best set of variables describing the topic and word distributions.

C.1 Implementing the Topic-Modeling Approach and Examples

To analyze the topic structure of consulting contracts, we use the universe of 8,788 contracts and 1,203 amendments filed with the SEC from 1994 to 2015.

Our procedure consists of two steps. In the first step, the LDA algorithm analyzes the text of the full universe of contracts to identify common topics. Each topic is a matrix that contains two types of elements—a set of words that the procedure identifies as related to each other in terms of their meaning, as well as a probability attached to each word, which captures the probability that the word is indeed semantically related to the other words within the topic.

Figure 4 provides a visual representation of two sample topics among the ones the LDA identifies in the first step of the procedure. Each graph in Figure 4 is a cloud representation of the two crucial elements of each topic—the words that are related enough to constitute a topic and the probabilities attached to each word (font size).

Consider the topic in Panel A, which we label "Arbitration to solve controversies between parties." The vast majority of the words that enter this topic are related to the procedures to be used in case of controversies between the principal and the agent. The words with the highest probability of belonging to this topic are "arbitration" and "arbitrator," which intuitively suggests that several contracts resort to arbitration for the solution of potential future controversies. Other forms of resolution seem less likely but still present in some contracts, as is evident from the words "trial," "tribunal," and "judge" showing up with lower probabilities.

Casual perusal of the other words that enter the topic seems to suggest that the LDA is effective. Most words that enter the topic with high and medium probability relate to controversies, such as "controversy," "jurisdiction," "claims," "damages," "breach," "provisions," "interpretation," "enforceability," and many others.

Of course, not *all* the words the procedure identifies will necessarily and without doubt refer to the topic. Looking actively for words barely related to controversies and checking their probability is another way to assess our procedure. For instance, the term "aaa" on the north-western part of the cloud does not seem to obviously relate to the topic. Reassuringly, the probability assigned to this term is low. The term "san" in the

northern part of the cloud, which is also attached a low probability, seems also barely related to controversies.¹⁰ A second caveat to keep in mind is that some of the words that enter the topic might not be uniquely related to that specific topic. For instance, the words "writing," "county," or "hereof" could be plausibly found in several parts of a contract.

Panel B of Figure 4 shows the words and probabilities that constitute another topic the LDA analysis identifies, which we label "Relationship to company's board members." The qualitative assessment we discussed above applies very similarly to this topic as well as to the other topics the procedures identifies. In Section VI, we discuss in more depth additional topics and especially the topics that we find increasing in contracts in our difference-in-differences analysis.

Overall, the ability of the LDA to identify meaningful topics in the universe of contracts depends on its ability to select words that relate to a topic as well as to attach high probabilities to the words that are most related to the topic and the examples in Figure 4 support the viability of the procedure in our sample of consulting contracts.

An important feature of the LDA procedure is that it requires an upfront decision about the optimal number of topics the researcher wants the procedure to identify in the universe of contracts available. To inform this assumption, we compute the *perplexity score* proposed by Huang et al. (2018).¹¹ As a criterion, we use the number of topics that minimizes the perplexity score locally, which is 200 topics in our universe of contracts (see Figure A.2 of the Online Appendix). This value means that the procedure isolates the most common 200 recurring topics in the universe of contracts. To ensure that our results are unrelated to this assumption, for robustness we also use a low value of 100 optimal topics and a high value of 300 optimal topics as alternative assumptions and construct the measures separately based on these assumptions.

After having identified the set of 200 optimal topics based on the universe of contracts, the second part of the procedure computes the number of topics (among the 200) each

¹⁰Possibly, the LDA selects this term because several contracts might report the city in which controversies should be solved, and California and Texas are two states in which we observe many contracts and in which the term "san" is commonly part of the name of several large cities.

¹¹For a definition and discussion of the perplexity score, please see page 2851 of Huang et al. (2018).

contract includes. We consider each sentence of each contract that enters our analysis. The procedure analyses the words in each sentence and assigns the sentence to one of the topics the LDA identified in the first part based on the similarity of the words in the sentence to the words that enter each topic. We then sum up the number of unique topics within each contract.

The number of unique topics in each contract is our baseline measure of contract completeness. This measure is a natural integer bounded between 0 and 200, which represents the count of the unique topics covered in the contract.

D. Count Measures of Contract Completeness

The most appealing feature of the topic-modeling based measures is their ability to capture multiple features of contracts at once consistently and objectively. At the same time, one might be concerned that the LDA method we propose is not transparent enough, or that other contract features might also proxy for completeness.

To tackle these concerns, we also propose a set of measures that are based on the count of words and sentences in contracts. Intuitively, the longer is a contract, i.e. the more the sentences and words are in the contract, the more likely it is that the contract disposes for more potential future states of the world. This is plausible, because the structure of consulting contract clauses is homogeneous, and the discussion of each contingency uses homogeneous semantics. Differences in contract length are thus unlikely to capture different writing styles, as would be the case with news or other narrative texts.

We propose three count-based measures of completeness—(i) the number of sentences; (ii) the number of words; and (iii) the number of unique words in each contract. We use a textual-analysis algorithms that simply simply counts the words and sentences in contracts.

E. Summary Statistics

Table 1 reports summary statistics for our sample. Panel A shows the number of contracts for each firm in the sample and across different types of contracts. Our working sample

consists of 6,081 consulting contracts, with an average of 3.3 contracts per firm and a median of 2 contracts per firm. About one third of the contracts (N=1,931) are in the control period, between 1994 and 2002 included (8 years), whereas roughly two thirds of the contracts (N=4,150) are in the treatment period, after the AA scandal, between 2003 and 2015 included (13 years). Moreover, in about two thirds of the sample agents are outsiders (N=4,067). The baseline analysis will focus on contracts with outsider agents, and we will propose a placebo test that consider insiders' contracts.¹²

Because of the novelty of our contract sample, we present the distribution of contracts across US industries (Table A.1) and across US states (Table A.2). We will keep variation across these two dimensions constant in our baseline analysis using fixed effects, which makes these (interesting) sources of variation irrelevant to our results. In Panel B of Table 1, we describe the variables at the contract level, which is our unit of observation. Statelevel shares of AA clients are defined more broadly but enter our analysis at the contract level. The share of clients of the *Big Five* consulting companies appear homogeneously distributed across space, and each *Big Five* covers between 11% and 15% of all contracts.¹³

We then summarize our main outcome variables—the measures of contract completeness defined above. We excluded the shortest contracts when computing these measures, because we do not have enough sentences to meaningfully apply our textual-analysis procedure. Completeness 200 is the topic-based measure when the LDA assumes an optimal number of 200 topics in the universe of contracts used to define topics. The average contract covers slightly less than 23 topics, but the variation is substantial, ranging from a minimum of 3 topics to a maximum of 71 topics. The median is close to the mean, which suggests that the distribution of topics is barely skewed in any directions. The distributions of the measures that assume 100 or 300 optimal topics are quite similar. For the count-based proxies of completeness, the average number of words is 1,168, and 465 of these words are unique. This difference justifies using both measures in the analysis. Also, the average contract has 69 sentences.

¹²As we discuss in more detail below, by construction shareholders trust company insiders, typically board members, management, or other employees, in the same way as they trust the management to negotiate consulting contracts on their behalf.

¹³These shares do not sum up to 1, because of individual contractors and smaller consulting firms.

As far as other contract features are concerned, Non-compete is a dummy that equals 1 if the contract includes a non-compete clause, which is the case for about 30% of the sample. A subset of contracts (N=4,949) express their duration—21 months on average. Also, 3.5% of the contracts are renegotiated and one third are disclosed through 8-K forms. Moreover, 29% of the agents are legal persons (Company). Finally, 32% of all contracts include stock option payments and about 42% include stock grants. Overall, about two third of all contracts include at least one form of equity incentives.

IV Shock to Trust in Big Business Practices

In this section, we describe and validate the drop in trust between principals and agents we use in our difference-in-differences analysis.

A. Enron Scandal and the Demise of Arthur Andersen

Enron Corporation was a Texan energy company. This public company was involved in one of the largest accounting fraud scandals in history—the Enron scandal—which led to the bankruptcy of the company. According to trial evidence, the company had hid billions of dollars in debt from failed deals and projects for years, making wide use of a set of accounting loopholes, special purpose entities, and poor financial reporting.

Arthur Andersen LLP (AA)—Enron's auditor and consultant—did not report these misguided practices. On March 5, 2001, Bethany McLean, an American journalist, questioned Enron's stock price by publishing a Fortune article titled as "Is Enron Overpriced?" Despite the doubts and accusations raised in the article, Enron did not take any action until October 16, 2001, when they announced major restatements to their end-of-fiscal-year accounts for the years between 1997 and 2000. One month later, on November 30, 2001, Enron filed for bankruptcy amid the drop in stock price that followed the news about restating financial statements so heavily.

Apart from Enron's management, AA, auditor and consultant, was accused of negligence and fraudulent behavior. On January 17, 2002, Enron dismissed AA accusing them of fraudulent consulting and the destruction of documents that would prove AA's

misbehavior. For the latter accusation, AA was found guilty of obstruction of justice. On August 31, 2002, amid the scandal that followed the court's ruling, AA surrendered its CPA license and shrank its business activities by laying off about 85,000 employees. Even if the US Supreme Court overturned AA's conviction unanimously in 2005, the scandal and loss of reputation loomed so large that AA stopped most of their non-consulting operations. Part of AA's consulting activities continued through Accenture.

B. Drop in Trust in Big Businesses Practices

The AA scandal was a form of business malpractice based on the contractual relationships of big corporations with external consultants. A generalized drop in small shareholders' trust in the practices of large corporations seems plausible. And, indeed, as we showed in the left panel of Figure 1, the public's trust in big businesses practices dropped substantially after 2002 and stayed low throughout our sample period.

Because the public includes the vast majority of public companies' shareholders, this drop in trust has had two effects. The first effect operates on the extensive margin, whereby shareholders decide to exit their investment in public companies due to their drop of trust in the management. Giannetti and Wang (2016) document and analyze this effect. At the same time, a contemporaneous effect might operate through the intensive margin—those shareholders who decide not to exit must trust the management enough to not liquidate their shares, and yet their trust in business practices, including the contractual relationships with outside consultants, might have dropped. In the paper, we focus on this intensive-margin effect of the drop in trust in big businesses' practices on the part of small shareholders who do not liquidate their holdings.

The raw-data, time-series evidence in the left Panel of Figure 1 is not sufficient to conclude that the AA scandal was a shock to trust in business practices. On the one hand, other contemporaneous shocks might have contributed to this drop in trust. On the other hand, the scandal might have affected other aspects of shareholders, management, and consultants' preferences and beliefs.

B.1 Variation in Exposure to the Scandal Across US States

To assess these concerns, we propose three tests. First, following Giannetti and Wang (2016), we exploit cross-sectional variation in the salience of the shock to shareholders. Specifically, we use the state-level share of public companies that were AA clients in 2000—before any concern about potential wrongdoing related to the AA scandal erupted—as a proxy for the salience of the scandal among local shareholders, which, because of the home bias phenomenon, are overrepresented among the shareholders of local public companies (e.g., see Coval and Moskowitz (1999)). The shock was likely more salient to households in states with a high share of AA clients, because they were more likely than out-of-state households to be shareholders of AA clients and more likely to be exposed to the local coverage of the scandal, which indirectly affected local public companies. The salience channel our interpretation proposes, that is, the possibility that the beliefs and trust of shareholders in locations that were more exposed to the scandal reacted more than others' trust, is consistent with earlier research that has documented this type of channel in the US and abroad (e.g., see Gurun et al. (2017), D'Acunto (2019a), and D'Acunto et al. (2019)).

Figure 3 is a state-level heatmap of the variation of the share of AA clients in 2000. The darker is a state, the higher is the share. We detect no obvious spatial clustering: Substantial variation exists within the group of large states that include many US public companies, such as California, Texas, New York, Massachusetts, and Illinois as well as within the group of smaller states across all US regions. We also report the state-level shares of clients of other Big 5 consulting firms in Table A.3 of the Online Appendix.

Based on the raw spatial pre-exposure to AA of shareholders across US states before the scandal, we test whether the state-level variation in the share of AA clients helps explain the variation in the public's trust of large corporations' business practices using the individual responses for waves of the Gallup Trust Survey between 1990 and 2015 (see Giannetti and Wang (2016) for a detailed description of this source). We estimate the following linear specification:

$$Trust_{i,s,t} = \alpha + \beta \ AA \ Share \ in \ 2000_s \times After \ 2002_t + X'_{i,s,t}\delta + \eta_s + \eta_t + \epsilon_{i,s,t}, \tag{1}$$

where $Trust_{i,s,t}$ is the amount of trust in the business practices of large corporations by respondent i in state s in year t; AA Share in 2000 $_s$ is the share of public companies in state s that were clients of Arthur Andersen in 2000; After 2002 $_t$ is an indicator variable that equals 1 for the period 2003-2015, and zero for the period 1994-2002; X is a vector of respondent-level characteristics that include the logarithm of age, race dummies, a dummy for whether the respondent identifies as a Republican voter, a dummy for whether the respondent is Protestant or Jewish, a dummy for male respondents, married respondents, and respondents in the top bracket of income; η_s and η_t are full sets of fixed effects for states and years. We limit the sample to respondents who have at least a college degree, because shareholding is much more likely for college-educated individuals and hence these respondents are more likely to capture the beliefs of public companies' shareholders. We estimate equation (1) by weighted least squares, in which we weigh observations by the number of respondents in each state.¹⁴

Columns (1)-(3) of Table 2 report the results from estimating equation (1). In column (1), we find that trust in big businesses after 2002 decreased in all US states, but more so in states whose share of AA clients among local public companies was above the 75th percentile before the scandal. For other states, trust decreased by 4.5 percentage points, whereas for states with the highest share it decreased by about 100% more. Overall, trust in big business practices dropped by about one quarter of the average level of trust in the full sample (31.4%). In columns (2)-(3), we add year and state fixed effects to ensure that our baseline result is not driven by business cycle shocks common to the whole US or to time-invariant characteristics of US states. The results are quantitatively and qualitatively similar. Overall, the share of AA clients across US states in 2000 is negatively associated with the extent of trust in big businesses by local households, who are more likely to be found among the small shareholders of local public firms than others.

¹⁴Given the low number of respondents in some smaller states, the representativeness of their answers might be lower and hence we put less weight on those observations.

B.2 Falsification Tests: Share of Clients of Other Consultants and Different Forms of Trust

The results so far cannot rule out two alternative explanations. First, general trends in the consulting industry might drive the patterns in Table 2; for instance, local firms might start choosing small consulting shops over large consulting firms (Big 5) after 2002. To address this concern, we re-estimate equation (1) using dummies for the other Big 5 consulting companies. If our results were capturing general trends in consulting, instead of an effect specific to AA, we should find similar estimates as those discussed above. Instead, in columns (4)-(7) of Table 2 we fail to reject the null hypothesis that the trust in big businesses by local small shareholders did not change across states based on the 2000 share of clients of other Big 5 consultants. The coefficients are, if anything, positive, although economically small and statistically insignificant.

A second concern is the Enron scandal might have also affected shareholders' trust in *other* institutions that are important for contract design. For instance, trust in the judicial system, which is crucial to the enforcement and hence the design of contract. We exploit the fact that the Gallup Trust Survey elicits trust for a broad set of institutions at the same time and on the same respondents. We can test directly whether the variation in the AA share predicts variation in trust towards other relevant institutions. We do so in columns (8)-(10) of Table 2, in which we estimate equation (1) replacing the outcome variable with the trust in other institutions: Small business practices, the judicial system, and banks. We find no economically or statistically significant change in the trust in these institutions after 2002, across states with a higher or lower share of AA clients in 2000.¹⁵

Overall, the falsification tests suggest that the drop in trust in big business practices predicted by the pre-scandal share of AA clients across US states is peculiar to AA relative to other large consulting firms, and does not percolate to other relevant institutions.

¹⁵In untabulated results, we also repeat this exercise for the other institutions the Gallup Trust Survey considers, and we find similar non-effects across the board. We do not tabulate these results because the connection between the other institutions, such as the Armed Forces, and contract design is not obvious, but the results are available upon request.

V The Effect of Trust on Contract Completeness

Armed with the negative shock to trust between shareholders and business practices, including consulting practices, we move on to estimate the effect of a drop in trust among parties on contract completeness. We estimate the following specification:

$$Completeness_{i,j,s,p,t} = \alpha + \beta \ Treated_s \times After \ 2002_t + X'_{j,s,p,t} \delta + \eta_t + \eta_p + \eta_s + \epsilon_{i,j,s,p,t}, \ \ (2)$$

where $Completeness_{i,j,p,k,t}$ measures completeness of contract i signed by firm j in state s industry p as of year t. Treated is a dummy variable that equals 1 if firm j is headquartered in a US state in which the share of local public companies clients of AA in 2000 was in the top 25% of the distribution, and zero otherwise, or the underlying continuous share of public firms in a state that were clients of AA in 2000. $After\ 2002_t$ is a dummy variable that equals 1 if the contract was signed in 2003 or later, and zero otherwise.

We add a full set of year fixed effects (η_t) to absorb US-wide business cycle and regulation shocks, industry fixed effects (η_p) to ensure that systematic differences in contract completeness due to the nature of business activity do not drive our results, and state fixed effects (η_s) to absorb state-level legal and regulatory characteristics invariant over time, which might affect both contract completeness and the pool of available consultants in a state. The sample period is between 1994 and 2015 and the sample includes all the contracts we observe signed between a firm and outsider consultants, because trusting insiders, who are shareholders and/or management, should not change in our setting. We formally test this argument in the falsification analysis below.

To estimate equation (2), we cannot use a linear estimator like OLS, because the outcome variable $Completeness_{i,j,s,p,t}$ is a count variable, a set of natural numbers, and OLS estimates would be biased in unknown directions. We use a negative binomial estimator, which accounts for the count nature of the outcome variable and allows for potential overdispersion in the distribution of contract completeness. We cluster standard errors at the level of the state, which allows for correlation of unknown form across the observations of contracts in the same state over time. Because our data include 23 years, we do not cluster standard errors also at the year level due to the small number of clusters,

which would likely result in less conservative estimates.

Because our main covariate of interest, $Treated_s \times After\ 2002_t$, varies at the state-year level, our specifications cannot include a full set of state-year fixed effects to absorb potentially different business cycle shocks or other contemporaneous shocks at the state level that might explain contract completeness and might be stronger in states with a higher pre-share of AA clients, on top of the AA scandal. In the most complete specifications we instead add a set of firm-level time-varying controls that might explain contract completeness within firms over time.

We add the set of contract-level characteristics we can observe in our data. 8KReporting is a dummy that equals 1 if the firm reported the consulting contract in an 8-K filing, as opposed to the 10-K or 10-Q filings. Contracts reported through 8-K forms might in principle differ systematically from other contracts. If firms move to 8-K reporting over time and especially after 2002, we need to absorb this variation. Company is a dummy that equals 1 if the consultant is a legal person, and zero if it is an individual. Arbitration is a dummy that equals 1 if the contract chooses arbitration to solve disputes relative to accessing to the judicial system. By construction, choosing arbitration requires more features to be discussed in the contract and is mechanically associated with higher completeness. We also add two proxies for firms' performance and operations risk—Return and Volatility—which correspond to the average return of the firm's stock and the volatility of the firm's stock at each end of fiscal year. Finally, we control for the logarithm of states' yearly GDP as a direct proxy for time-varying business cycle shocks at the state level.

We report the baseline estimates of equation (2) in Table 3. The estimated coefficient attached to $Treated_s \times After\ 2002_t$ is stable across specifications in columns (1)-(3) as we add fixed effects and controls to the analysis, which reduces concerns that unobserved heterogeneity might explain the results. Across all specifications, the sign of the coefficient is positive and statistically different from zero, which suggests that a drop in trust between shareholders and business counterparties leads to an increase in contract completeness.¹⁶

To interpret the magnitude of these coefficients, recall that we use a negative binomial

¹⁶In all specifications that include state fixed effects, the level of the treatment variable is absorbed.

estimator. The coefficients provide the log-difference in the levels of the outcome variable for observations in which the dummy variable equals 1 and other observations. For the case of $Treated_s \times After~2002_t$, for instance, the logarithm of the number of topics in contracts signed by firms at the top of the state-level distribution by AA clients in 2002 is 0.101 higher than the logarithm of the number of topics in other contracts both before 2002 and across firms in states with a lower share of AA clients.

To assuage this effect, we compare it to the average value of the outcome variable in the sample, which is 22.96 topics. The natural logarithm of 22.96 is 3.13, and 3.13 + 0.101 = 3.231, whose level corresponds to 25.30. Thus, a contract signed in a state with a high share of AA clients in 2000 covers 2.34 topics more after 2002 relative to before 2002 and to contracts signed in other states, which corresponds to 2.34/22.96 = 10.2% of the average contract completeness in the sample.

Other controls in column (3) that by construction should capture more complete contracts—Arbitration and Company—indeed display a positive association, which is reassuring given that our sample and the proposed measures of completeness have not yet been validated by other research.

In columns (4)-(6) of Table 3, we estimate equation (2) using the continuous value of the 2000 state-level share of AA clients. The sign, statistical significance and magnitude of the estimated coefficients are similar. The coefficient attached to $Treated_s \times After~2002_t$ is the change in the logarithm of the number of topics in states with a share of AA clients of 1 relative to a share of AA clients of zero. The value of 0.635 in column (6) implies the number of topics covered is 43.16 - 22.96 = 20.2 higher in the former group. Moving from the 25th percentile to the 75th percentile of the AA share is an increase of 0.068, which corresponds to 1.37 more topics covered—about 6% of the average number of topics covered by the contracts in our sample.

A. Robustness: Alternative Measures of Completeness

In Table 4, we verify the robustness of the baseline result across alternative specifications and different measures. For each Panel, columns (1)-(3) use the dummy that equals 1 if the contract is signed in a state in the top 25% of the distribution of AA clients as of

2000, and zero otherwise as the main covariate of interest. In columns (4)-(6), we use the continuous value of the share of AA clients in states as of 2000.

In Panel A, we weigh observations based on the number of firms in each state. These specifications put more weight on the contracts signed in large states—California, Texas, New York, Illinois, Massachusetts, and New Jersey.¹⁷ Small states do not drive our results. If anything, the estimated magnitudes are slightly larger in the weighted specifications.

In Panels B and C, we propose OLS specifications. As discussed above, linear estimators are likely to be biased with count outcome variables, but nonetheless we confirm the robustness of our baseline estimates.

In Panels D and E, we use the two alternative topic-based measure of contract completeness based on 100 topics or 300 topics, and our results barely change. ¹⁸ This test verifies that the assumption about the optimal number of topics in our LDA algorithm is not consequential to our results.

Finally, in Panels F, G, and H, we use the count measures of contract completeness we discussed in section III, that is, the number of words and sentences in each contract, either in full or unique. The positive effect of a drop in trust on contract completeness is replicated when we use the count-based measures.

B. Alternative Explanations and Falsification Tests

A concern with our analysis thus far is that the characteristics of firms that disclose their materials contracts to the SEC might have changed differently for high-AA and low-AA states over time, and this differential change, rather than the drop in trust after the AA scandal, might potentially explain our difference-in-differences results. Contrary to this possibility, in Panel A of Figure 5 we find that characteristics such as the size of disclosing firms (number of employees), their leverage, or the share of high-tech-industry firms over all disclosing firms does not follow the same patterns we uncover for trust in big business practices and for contract completeness.

On the other hand, one might wonder whether the pool of available consultants

¹⁷See the distribution of contracts by states in Table A.2.

 $^{^{18}}$ This fact should not come as a surprise, because the summary statistics of the distributions of the three topic-modeling variables in Table 1 are quite similar.

has systematically changed across states and over time based on the AA scandal, and because of this change in the pool of available consultants rather than to a drop in trust principals might have started to write different contracts. In Panel B of Figure 5, we find that this explanation is quite unlikely, because for the set of characteristics of consultants we can observe (whether consultants are individual contractors rather than employees of consulting firms, whether consultants are external or internal, and whether consultants are CEOs of their companies) we detect no systematic differences around 2002, which contrasts with the patterns of dropping trust in business practices and increasing completeness of consulting contracts.

To further corroborate our interpretation of the baseline results, we perform a set of placebo and heterogeneity tests. We start by considering consulting contracts with firms insiders. These contracts are often signed to provide an alternative form of payment to insiders or to ensure delayed severance payments to retired managers and hence are usually mere vehicles for compensation above and beyond insiders' formal compensation. Trust should have barely any role in the design of these contracts, because most firm insiders are also principals (shareholders) through their stock holdings. Even in the rare cases of managers or board members that own no stocks of the company, shareholders trust such managers and board members enough to let them manage the company.

We estimate equation (2) on contracts between the firm and an insider. Insiders include board members, management, or other employees of the firm. Columns (1) and (6) of Table 5 show that, consistent with our conjecture, contract completeness does not differ systematically for insider contracts. This non-result holds true in terms of both economic and statistical significance. We interpret this test as another way to support our interpretation of the interaction $Treated \times After~2002$ as capturing a drop in trust as opposed to other economic or regulatory contemporaneous shocks, which should have affected the design of all consulting contracts, including insider contracts.

The second falsification test considers the state-level share of clients of other *Big* 5 consulting companies. Because these shares do not predict a drop in trust, based on our interpretation we should find no effect on contract completeness either. In Table 5, columns (2)-(5) and columns (7)-(10) corroborate this conjecture. If anything, for one

of the other companies, Deloitte, we find a significant negative coefficient. This result, though, is not replicated in other specifications that change the set of fixed effects and controls.

VI Completeness and Complexity: Qualitative Analysis of Added Clauses

As we discussed in Section III.B., higher contract complexity only implies higher completeness if the additional clauses in the contract refer to verifiable contingencies, but our text-analysis based measures cannot inform us on the verifiability of contract clauses. Our analysis so far has assumed that at least one of the clauses added to contracts refers to a verifiable contingency. To better understand whether contracts become more complete after the negative shock to trust we study rather than merely more complex, in this section we propose a complementary analysis to assess which specific clauses are more likely to be added to contracts. Once we identify the specific clauses that are more often added to contracts, we can more concretely assess whether the additional clauses refer to foreseeable and verifiable future states of the world for which earlier contracts were not planning.

Note that this analysis, although helpful to understand contract completeness, cannot be our main empirical test due to a set of shortcomings. First, this analysis does not let us summarize contract features in one single variable or estimate the magnitude of the changes to contract features over time and across states, which is what we did in the first part of the paper. Second, this analysis is subject to a multiple-hypothesis-testing problem: because we identify 200 topics through the LDA procedure, testing for whether any of 200 topics are added to contracts consists of a large set of multiple hypotheses that could reject the null for at least some topics mechanically even if no significant relationships existed in the data. To alleviate this issue, we verify that the topics that are more likely to appear in contracts based on the difference-in-differences specification correspond to the topics that are more likely to appear in contracts based on simple averages in the raw data. Moreover, we look for common semantic patterns and verify

that the topics that get added to contracts do belong to a similar semantic group, i.e. restrictions and impositions to agents on the part of principals.

Keeping these shortcomings in mind, in Table 6 we report the estimates of the difference-in-differences coefficient for estimating equation (2) when the outcome variable is a dummy that equals 1 if a topic appears in the contract, and zero otherwise, for each of the 200 topics the LDA procedure identifies. In the table, we only report the results for the topics for which the interaction coefficient is positive and statistically significant and hence we can reject the null that the topic was not more likely to be added in contracts signed after 2002 in high-AA states.

To assess these topics qualitatively, in Figure 6 we show the cloud representation of the elements of each topic—the words that constitute the topic as well as the probabilities attached to each word (font size)—similar to the examples we discussed in Figure 4. Note that the LDA procedure does not require that the number of words that appear related enough to constitute a topic is the same across all topics and at the same time to guarantee that the graphical representation is readable, we do not report the words whose probability is quite low and hence whose font would be so small that it cannot be read. Some clouds depicted in Figure 6 appear to include less words than others for this reason. Topics related to more sparse clouds include many unreported words whose probability of being part of the topic is quite small.

A common theme across the topics that appear more often in consulting contracts signed after 2002 in high-AA states is the imposition of restrictions to agents, which limit the agents' action during and after the contractual relationship. Under this common theme, the topics are compatible with the possibility that, due to the negative shock to trust we consider, principals started to impose stricter requirements to agents and to plan explicitly in the contract for potential future states of the world in which agents could have taken advantage of principals.

The first topic refers to confidentiality and the secrecy of proprietary data that the agents would access during the contractual relationship (Panel A). This topic includes words referring to information ("information," "documents," "operations"), to agents' obligations ("obligation," "agents," "compliance," "responsibility"), and specifically to

the state of the world in which information is disclosed by agents to third parties ("disclosure," "confidentiality," "damages," "liability").

The second topic details the conditions that might cause the termination of the consulting agreement (Panel B). This topic includes terms related to the termination of the contract ("termination," "expiration," "effect,") as well as several potential causes that could trigger termination, which are presumably attributed to the agent ("cause," "failure," "death," "disability," "felony," "misconduct," "duties," etc.).

The third topic (Panel C) refers to potential amendments and conditions for amending the contract ("amendment," "consideration," "term," "witness," "force") and the fourth topic (Panel D) to indemnification—compensation for losses (presumably) suffered by the principal—("indemnification," "indemnitee," "settlement," "liability," "litigation").

The fifth topic we detect as appearing more often is depicted in Panel E of Figure 6. We refer to this topic as covering restrictions to agents' use of equity compensation, because many of the terms that compose the topic seem to refer to detailed conditions under which agents can exercise the equity incentives they are paid as part of their consulting activity: "stock options," "restricted," "vesting," "terms," "exercise," "expiration," "conditions," and "contingent."

The last type of clauses whose presence we detect increasing in columns (6)-(8) of Table 6 are non-compete agreements. We do not provide a cloud representation of this clause, because here we are pooling together three different topics all of which refer to non-compete as an important word in the topic. In the Table we thus estimate the specification in equation (2) where the outcome variable is a dummy that equals 1 id any of the three non-compete-related topics exist in a contract, and zero otherwise.

Non-compete agreements oblige the agent not to engage in competing activities with the principal during and/or after the end of the consulting contract up to an agreed period of time. Such clauses aim to protect the principal and avoid that the agent might exploit proprietary information such as clients' contacts and proprietary business information (e.g., trade secrets) to engage in activities in competition with the principal.

The non-compete clause is an especially interesting one for our analysis because

the enforceability of this type of clause differs systematically across US states (see, e.g., Jeffers (2018), Garmaise (2011), and Starr (2019)). For this reason, the test gives us an additional source of variation relative to other clauses: if non-compete clauses were added to contracts because of an explicit negotiation between principals and agents, rather than just because of changing consulting contract templates, they should only appear more frequently in states in which they are enforceable. These clauses would be barely relevant in other states due to the lack of enforceability. They would increase the complexity of contracts rather than their completeness.

And, indeed, when comparing columns (7) and (8) of Table 6 we find that the likelihood that non-compete clauses are added to consulting contracts in high-AA states after 2002 is positive, large, and statistically different from zero, whereas we cannot reject the null that these clauses are not more likely to be added in states in which they cannot be enforced. In fact, the estimated coefficient is negative in the latter case albeit statistically not different from zero.

Overall, our analysis of the topics and clauses that appear more often in consulting contracts after a negative shock to trust, although qualitative, seems to point in one direction: Contracts signed after the shock include more discussion and provisions for potential states of the world in which agents might take advantage of principals and behave unfairly, which accords with our definition of breach of trust throughout the paper. Indeed, these new topics provide for cases in which agents might disclose private and confidential information they obtained during the contractual relationship, might engage in unfair competition against the principal, might engage in behaviors that should trigger the termination of the relationship, and might be required to indemnify principals for harm or losses they might have caused.

As we discussed above, the additional clauses increase contracts' completeness only if they refer to verifiable states of the world. Although a formal empirical test of this statement cannot be designed, qualitatively the new states seem to be plausibly verifiable. Whether an agent engages in unfair competition with the principal, whether the agent engages in one of the actions that are deemed as damaging in the contract, or whether the agents exercises his/her equity incentives in ways that violate the terms and conditions

in the contract are verifiable states.

Finally, note that our quantitative analysis in the first part also falls short from disentangling two other different channels. On the one hand, the states of the world for which contracts started to provide after the negative shock to trust might have not be foreseen by principals and agents when they signed consulting contracts before the shock. On the other hand, principals and agents might have been fully aware that such states of the world were possible, but might have expected them to arise with a quite low probability and might have trusted the counterpart enough that negotiating the additional clauses was perceived as a waste of time and resources. The first possibility would be plausible if contracts started to display provisions for situations that could barely be expected in the past, such as for instance states of the world that might be produced by technology advancement and that did not exist before certain technologies were created. The second possibility, instead, would be plausible if the states for which contracts started to provide were standard and easily foreseeable both before and after 2002 as well as across US states irrespective of local shareholders' exposure to the Arthur Andersen scandal.

The qualitative analysis of topics speaks to this question, because it is rather implausible that the principals in our setting—shareholders and managers of companies regulated by the SEC—could not foresee the possibility of agents' unfair competition, of disclosure of proprietary information, or that agents might have engaged in behaviors that would produce damage to the principal. For instance, the possibility of violating the secrecy and confidentiality of data and information acquired during a principal—agent relationship has been part of private contracting for centuries and at least since the codification of Roman Law—see the notion of actio servi corrupti. As far as noncompete agreements are concerned, their nature and the debate about their enforceability in principal—agent relationships has been debated in common law at least since the fifteenth century.

Ultimately, the topics and clauses that start entering contracts refer to quite standard and foreseeable states of the world both before and after 2002 and across US states. Likely, what has changed after the shock was principals' trust in agents' behavior and hence principals' willingness to put in writing in the contract provisions for such foreseeable

state of the world. This interpretation holds similarly irrespective of whether companies' shareholders pushed managers to engage in tougher negotiations with agents after the scandal or whether managers realized that they needed to insure themselves against these states of the world to avoid potential push back on the part of shareholders had agents behaved against the interest of the company. In both of these cases, contracts would become more complete after a negative shock to trust between principals and agents.

VII Conclusions

We document that, after a drop in principals' trust towards agents, the completeness of principal-agent contracts increases using a large and novel sample of US consulting contracts. This result arises across several proxies of completeness and does not survive a set of falsification tests. The effects of trust on contract completeness do no fade throughout our sample period. Moreover, our qualitative analysis of the specific clauses that tend to be added to contracts after the negative shock to trust reveals that such additions provide more restrictions to agents' actions, especially in states of the world that were plausibly foreseeable both before and after the shock and in which agents might have caused a damage to principals.

Whether completing contracts is triggered by shareholders' explicit pressure on managers to complete the contracts signed with (untrustworthy) agents or whether managers complete contracts to insure themselves against possible actions of shareholders after a damage caused by agents—actions that were foreseeable before and after the shock and that managers could have provided for in contracts irrespective of the shock—cannot be disentangled in our analysis and represents an interesting follow-up question for future research.

Our results also open paths for other research avenues. Understanding the dynamics of the effects of trust on contracting—e.g., whether trust evolves and builds up after continued interactions between parties and more information is produced—is a wide open question. For instance, the interaction between cultural and ethnic affinity and trust among parties has only recently started to be studied both theoretically and empirically

(Guiso and Makarin (2020), Fisman et al. (2017)). Our results also leave open the question of what is the right amount of trust (Butler et al. (2016)), that is, whether the higher contract completeness deriving from lower trust is ultimately welfare improving or reducing. Whereas more complete contract presumably require spending higher costs of negotiation by both parties and restrict agents' actions, a different setting is needed to estimate comprehensibly the economic effects for both parties and competitors.

Also, the extent of completeness is a defining feature common to all types of contracts. How does trust relate to other features that are specific to certain classes of contracts and sectors? For instance, Gennaioli, La Porta, Lopez-de Silanes, and Shleifer (2020) study the effects of trust and honesty on the premia and damage payments of insurance contracts. And, could private interventions (Barone et al. (2015)) and automated interventions such as robo-advising tools (D'Acunto et al. (2019), D'Acunto and Rossi (2020)) avoid the effects of a drop in trust among counterparties on contract negotiations and design?

Moreover, our results focus on a setting in which one agent contracts with one principal. What is the theoretical and empirical effect of trust on contract design in multi-party settings, such as the case of syndicated loan contracts, in which each party is endowed with an amount of trust toward others? Do high and low levels of trust toward a counterpart transfer to others, for instance between a supplier and a customer engaging with the same party? Future research should study viable empirical and theoretical settings to answer these and other open questions on the effects of trust on contracting.

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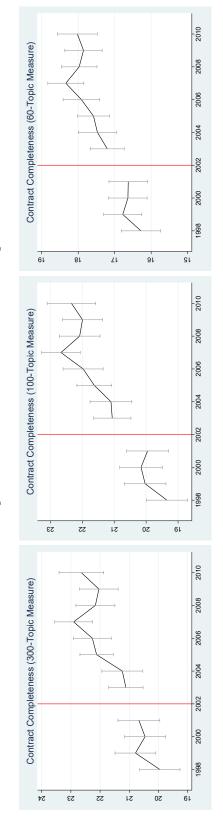
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Figure 2: Contract Completeness over Time: Other Measures

A. Alternative Topic-Based Measures of Contract Completeness



B. Words and Sentences in Contracts

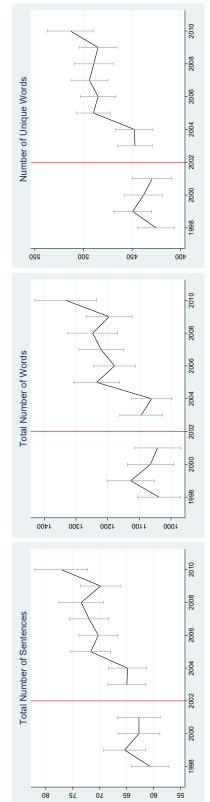


Figure 3: Geographic Variation in the Share of AA Clients in 2000

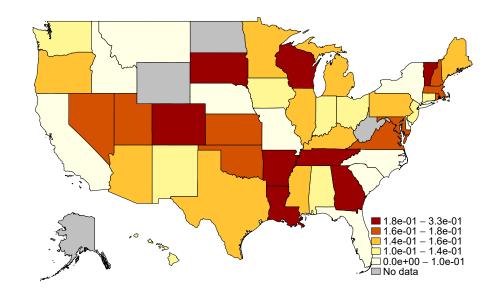


Figure 4: Examples of LDA Topics Identified in Consulting Contracts

A. Arbitration to Solve Controversies Between Parties

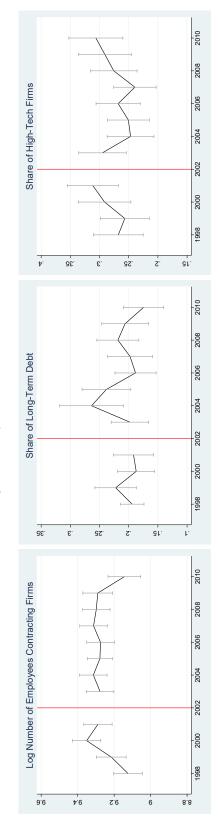


B. Relationship to Company's Board Members



Figure 5: Pools of Contracting Firms and Consultants Over Time

A. Contracting Firms by Observable Characteristics



B. Contracting Consultants by Observable Characteristics

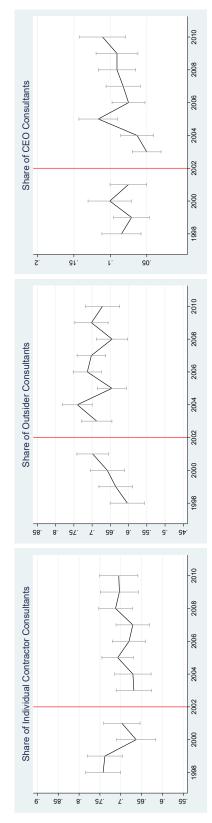


Figure 6: Topics Appearing More Often in High-AA States After the Negative Shock to Trust

C. Contract Amendments B. Contract Termination failure times death death learner benefit A. Confidentiality & Data Secrecy agent copies seem purpose right mention griffice representatives sentent agenciate varies assigns wherein the plant representatives assigns wherein an arthority representative representativ directors in the property of the purpose right of t

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D. Indemnification

E. Restriction Equity to Agent



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Table 1: Descriptive Statistics

This table reports summary statistics for the main variables we use in the analysis. The sample unit is at the contract level. Post is a dummy variable that equals 1 if a consulting contract is signed after January 1, 2003, and zero otherwise. Outsider refers to contracts signed between companies and external consultants. Insider refers to contracts signed between companies and internal consultants. Public refers to contracts signed between publicly listed firms and consultants. Private refers to contracts signed between private firms with SEC registration and any consultants. AA% is the fraction of public firms in a state that were clients of Author Anderson as of the end of fiscal year 2000. EY%, Deloitte%, PWC% and KPMG% are the fraction of public firms in a state that were clients of Ernst & Young, Deloitte, Pricewaterhouse Cooper and KPMG, respectively, as of the end of fiscal year 2000. # Words refers to the total number of words of each consulting contract. # Unique Words refers to the total number of unique words of each contract. # Sentences refers to the total number of sentences of each contract. Completeness 100, 200, and 300 refer to the number of topics of each contract calculated by the Latent Dirichlet Allocation (LDA) with 100, 200, and 300 as the total number of topics, respectively. Option is a dummy variable that equals 1 if a firm grants stock option to the consultant, and zero otherwise. Equity is a dummy variable that equals 1 if a company compensates a consultant with company shares. Option/Equity is a dummy variable that equals 1 if either stock option or equity compensation is included in the contract. Non-Compete is dummy variable that equals 1 if a non-compete clause is included in the contract, and zero otherwise. Duration is the time (in months) from the start to the end of the contract. Renegotiation is a dummy variable that equals 1 if the contract is amended after contracting, and zero otherwise. 8k is a dummy variable that equals 1 if contracting with a consultant is disclosed to investors as a specific corporate event, and zero otherwise. Company is a dummy variable that equals 1 if the agent is a consulting company, and zero if the agent is an individual consultant. Arbitration is a dummy variable that equals 1 if the contract allows the two parties to choose an arbitrator is disputes arise, and zero otherwise. Return is the state-level annualized stock returns (weighed by firm capitalization) over the past 12 months upon contracting. Volatility is the state-level standard deviation of market-adjusted returns (weighted by firm capitalization) over the past 52 weeks upon contracting, and zero otherwise. Ln (GDP) is the logarithm of state-level Gross Domestic Product in the year in which a contract is signed, and zero otherwise.

			Panel A	A. Numb	er of cont	racts per f	irm	
	Total	Mean	std	Min	p25	p50	p75	Max
# Total	6081	3.310	3.581	1	1	2	4	32
# Total, post=0	1931	2.177	1.808	1	1	2	3	13
# Total, post=1	4150	3.087	3.159	1	1	2	4	25
# Outsider	4067	3.312	3.754	1	1	2	4	32
# post=0, Outsider	1271	2.128	1.730	1	1	2	3	13
# post=1, Outsider	2796	3.139	3.280	1	1	2	4	25
# Insider	2014	1.946	1.722	1	1	1	2	14
# post=0, Insider	660	1.694	1.673	1	1	1	2	11
# post=1, Insider	1354	1.811	1.514	1	1	1	2	13
# Public	4671	2.776	2.813	1	1	2	3	24
# post=0, Public	2736	2.623	2.634	1	1	2	3	18
# post=1, Public	1935	2.234	1.984	1	1	2	3	13
# Private	1410	3.417	3.001	1	1	2	5	16
# post=0, Private	1071	3.088	2.321	1	1	2	5	10
# post=1, Private	339	2.510	2.437	1	1	1	3	11

			Panel B.	Contrac	t-level ch	aracteris	stics	
	Total	Mean	Std	Min	p25	p50	p75	Max
AA%	6081	0.133	0.043	0	0.092	0.139	0.160	0.333
$\mathrm{EY}\%$	6081	0.144	0.044	0	0.110	0.150	0.182	0.235
Deloitte%	6081	0.106	0.031	0	0.087	0.104	0.113	0.364
KPMG%	6081	0.103	0.030	0	0.089	0.107	0.120	0.211
PWC%	6081	0.149	0.044	0	0.120	0.141	0.189	0.385
Post	6081	0.626	0.484	0	0	1	1	1
Public	6081	0.768	0.422	0	1	1	1	1
Outsider	6081	0.669	0.471	0	0	1	1	1
Completeness 200	5909	22.960	8.050	3	18	22	28	71
Completeness 100	5909	21.115	7.097	3	16	21	25	62
Completeness 300	5909	21.501	7.472	2	17	21	26	76
# Words	5909	1167.741	970.474	100	609	972	1448	19439
# Unique words	5909	465.083	216.539	48	314	443	585	2038
# Sentences	5909	68.537	50.921	3	40	59	84	1067
Option	6081	0.316	0.465	0	0	0	1	1
Equity	6081	0.422	0.494	0	0	0	1	1
Option/Equity	6081	0.605	0.489	0	0	1	1	1
Non-compete	6081	0.299	0.458	0	0	0	1	1
Duration	4949	20.785	20.237	0.200	11.100	12.167	24.333	240
Renegotiation	6081	0.035	0.183	0	0	0	0	1
8K	6081	0.318	0.466	0	0	0	1	1
Company	6081	0.293	0.455	0	0	0	1	1
Arbitration	6081	0.292	0.455	0	0	0	1	1
Return	6081	0.132	0.237	-0.737	0.008	0.139	0.278	1.424
Volatility	6081	0.050	0.020	0	0.036	0.044	0.060	0.164
Ln(GDP)	6081	13.112	0.951	9.750	12.451	13.113	13.919	14.755

Table 2: Exposure to Arthur Andersen (AA) Scandal and Trust in Big Business Practices

This table reports estimates of β from the following linear specification by weighted least squares:

$$Trust_{m,s,t} = \alpha + \beta Top \ 25\%_s \times After \ 2002_t + X' \times \gamma + \eta_s + \eta_t + \epsilon_{m,s,t}$$

Top 25% is a dummy variable that equals 1 if AA% is above the 75 percentile of its sample distribution, and zero otherwise. In columns (4)-(7), Top 25% is a $1\ if$ the respondent declares himself/herself to be white, and zero otherwise. Black is a dummy variable that equals $1\ if$ the respondent declares himself/herself Protestant/Jewish is a dummy variable that equals 1 if the respondent declares himself/herself to be either Protestant or Jewish, and zero otherwise. Male is dummy variable that equals 1 if the share of clients of each of the other Big 5 consulting companies is above the 75 percentile of its sample distribution, and zero otherwise. After 2002 is a dummy variable that equals 1 if the survey was conducted in 2003 or later, and zero otherwise. White is a dummy variable that equals a dummy variable that equals 1 if the respondent is male, and zero otherwise. Ln(age) is the logarithm of the respondent's reported age. Married is a dummy variable that equals 1 if the respondent declares himself/herself to be married. High Income is a dummy variable that equals 1 if the respondent with household income above the US median household income. We cluster standard errors at the level of the state (k). We weigh observations by the number of total observations where $Trust_{i,k,t}$ is a dummy variable that equals 1 if a respondent m in state k reports a great deal or quite a lot of confidence in US big businesses in year t, and zero otherwise in columns (1)-(7), and confidence in the institutions reported on top of each column in columns (8)-(10). In columns (1)-(3) and (8)-(10), to be black, and zero otherwise. Republican is a dummy variable that equals 1 if the respondent declares himself/herself to be a republican, and zero otherwise. within the same state to overweigh more representative responses. The sample period is 1994 to 2015.

	${\rm Top}~25\%$	${\bf Lop~25\%~Share~AA~in~2000}$	in 2000	Top	Top 25% Share Big 5 in 2000	e Big 5 in	2000	Trust in Other Institutions Small Judicial	Other Institution	tutions
				EY	Deloitte	KPGM	PWC	Businesses	System	Banks
9 A A	(1)	(2)	(3)	(4)	(2)	(9)	(2)	(8)	(6)	(10)
Aiter 2002	-0.045 (0.008)									
Top $25\% \times \text{After } 2002$	-0.041**	-0.037**		-0.023	0.001	0.007	0.022	-0.018	-0.002	-0.002
		(0.015)	(0.016)	(0.019)	(0.024)	(0.015)	(0.014)	(0.048)	(0.024)	(0.017)
Top 25%		0.017*								
		(0.009)								
Constant		0.300***	0.277***	0.274***	0.269***	0.267***	0.264***		0.385***	0.332***
		(0.045)	$\overline{}$	(0.058)	(0.056)	(0.057)	(0.056)		(0.089)	(0.077)
Individual Controls	×	×	×	×	×	×	×		×	×
Year FE		×	×	×	×	×	×		×	×
Industry FE		×	×	×	×	×	×		×	×
State FE			×	×	×	×	×		×	×
Z	15130	15130	15130	15130	15130	15130	15130	6179	13092	15130
$adj R^2$	0.059	0.062	0.062	0.057	0.057	0.057	0.057		0.024	0.068

Table 3: Trust and Contract Completeness

This table reports estimates of β from estimating the following specification:

$$Completeness_{i,j,s,p,t} = \alpha + \beta \ Treated_s \times After \ 2002_t + X'_{j,s,p,t} \delta + \eta s + \eta_t + \eta p + \epsilon_{i,j,s,p,t},$$

where Completeness, i,j,p,k,t measures completeness of contract i signed by firm j in state s industry p as of year t. Completeness refers to the number of topics of contract calculated by the Latent Dirichlet Allocation (LDA) with 200 as the total number of topics. The construction of this measure and similar measures for robustness is described in section III. We estimate the specification using a negative binomial estimator due to the count nature of the outcome variable. Treated is a dummy variable that equals 1 if firm j is headquartered in a US state in which the share of local public companies clients of Arthur Andersen (AA) in 2000 was in the top 25% of the distribution, and zero otherwise, in columns (1)-(3). It is the underlying continuous share of public firms in a state that were clients of AA in 2000. After 2002_t is a dummy variable that equals 1 if the contract was signed in 2003 or later, and zero otherwise. Please refer to Table 1 for definitions of other variables. We cluster standard errors at the level of state (s). The sample period is from 1994 to 2015.

	Top	25% Share	AA		Share AA	
	$\overline{}(1)$	(2)	(3)	$\overline{}$ (4)	(5)	(6)
Treated	-0.054**			-0.623***	k	
	(0.023)			(0.203)		
Treated \times After 2002	0.107***	0.121***	0.101***	0.901***	0.792**	0.635**
	(0.041)	(0.035)	(0.030)	(0.330)	(0.332)	(0.270)
8K Reporting			0.023			0.021
			(0.016)			(0.017)
Company			0.124***			0.124***
			(0.018)			(0.018)
Arbitration			0.188***			0.188***
			(0.018)			(0.018)
Return			-0.050			-0.058
			(0.072)			(0.073)
Volatility			0.398			0.147
			(0.997)			(1.063)
Ln(GDP)			0.007			-0.019
			(0.131)			(0.120)
Constant	3.135***	3.113***	2.968*	3.105***	3.025***	3.232**
	(0.072)	(0.133)	(1.655)	(0.083)	(0.143)	(1.504)
Year FE	X	X	X	X	X	X
Industry FE		X	X		X	X
State FE		X	X		X	X
N	2772	2772	2772	2772	2772	2772
Pseudo R-sq	0.007	0.017	0.031	0.007	0.017	0.031

Table 4: Trust and Contract Completeness: Robustness

This table provides various robustness check of the results in Table 3. Across different panels, dependent variables take a variety of alternative measures for contract completeness. In Panel A, the dependent variable is Completeness200 but we perform weighted negative binominal regressions. We assign the number of public firms in each state k as of contracting year t as the weight. In Panel B, we perform OLS regressions and completeness is measured as the number of topics of Completeness200 divided by 200. In Panel C, we perform OLS regressions and completeness is a dummy variable that equals 1 if Completeness200 is above the median of its sample distribution, and zero otherwise. In Panel D and E, we perform negative binomial regressions and dependent variables are Completeness100 and Completeness300, respectively. In Panel F, G, and H, we perform negative binomial regressions and completeness is measured as the total number of words, sentences, and unique words of a contract, respectively. Please refer to Table 1 and Table 3 for definitions of other variables. We cluster standard errors at the level of state (k). The sample period is from 1994 to 2015.

variables. We cluster st	andard erro	rs at the leve	el of state (k) .	The sample period	is from 199	14 to 2015.
	(1)	(2)	(3)	(4)	(5)	(6)
	Pa	anel A. NE	B, W=# of fi	rms by state-year	, Topic 20	00
Treated \times After 2002	0.107***	0.131***	0.114***	0.698**	0.796***	0.678***
	(0.037)	(0.031)	(0.027)	(0.354)	(0.265)	(0.241)
Pseudo R^2	0.008	0.016	0.031	0.008	0.016	0.031
		Pa	anel B. OLS,	Completeness 20	0	
Treated \times After 2002	0.012**	0.014***	0.012***	0.096**	0.091**	0.076**
	(0.005)	(0.004)	(0.004)	(0.037)	(0.039)	(0.032)
Adj. R^2	0.036	0.067	0.155	0.037	0.067	0.155
	Pan	el C. OLS,	Dummy Co	mpleteness $200 A$	bove Meio	dian
Treated \times After 2002	0.186***	0.231***	0.207***	1.326***	1.497***	1.315***
	(0.032)	(0.037)	(0.039)	(0.366)	(0.358)	(0.356)
Adj. R^2	0.025	0.049	0.105	0.025	0.048	0.104
		\mathbf{P}_{i}	anel D. NB,	Completeness 100)	
Treated \times After 2002	0.117**	0.131**	0.115**	1.189***	1.043***	0.901***
	(0.051)	(0.053)	(0.045)	(0.339)	(0.370)	(0.305)
Pseudo R^2	0.009	0.018	0.033	0.009	0.018	0.033
		P	anel E. NB,	Completeness 300)	
Treated \times After 2002	0.122***	0.140***	0.119***	1.007***	0.912**	0.765***
	(0.041)	(0.043)	(0.034)	(0.332)	(0.356)	(0.283)
Pseudo R^2	0.006	0.016	0.030	0.006	0.016	0.030
		Par	nel F. NB, T	otal Number Wor	ds	
Treated \times After 2002	0.248***	0.226***	0.165***	1.730**	1.409**	0.744*
	(0.065)	(0.053)	(0.054)	(0.775)	(0.640)	(0.447)
Pseudo R^2	0.002	0.009	0.016	0.002	0.009	0.016
		Pane	l G. NB, Tot	al Number Sente	nces	
Treated \times After 2002	0.212***	0.207***	0.155***	1.731***	1.395**	0.876**
	(0.055)	(0.042)	(0.042)	(0.641)	(0.564)	(0.379)
Pseudo R^2	0.004	0.015	0.027	0.004	0.015	0.027
		Panel H	I. NB, Total	Number Unique	\mathbf{Words}	
Treated \times After 2002	0.146***	0.159***	0.122***	1.087**	0.892**	0.456
	(0.035)	(0.037)	(0.039)	(0.468)	(0.438)	(0.336)
Pseudo R^2	0.004	0.009	0.017	0.004	0.009	0.017
Year FE	X	X	X	X	X	X
Industry FE		X	X		X	X
State FE		X	X		X	X
Controls			X			X
N	2772	2772	2772	2772	2772	2772

Table 5: Trust and Contract Completeness: Falsification Tests

This table reports estimates of β from estimating the following specification:

 $Completeness_{i,j,s,p,t} = \alpha + \beta \ Treated_s \times After \ 2002_t + X'_{j,s,p,t} \delta + \eta s + \eta_t + \eta p + \epsilon_{i,j,s,p,t},$

where Completeness_{i,j,p,k,t} measures completeness of contract i signed by firm j in state s industry p as of year t. Completeness refers to the number of topics of contract calculated by the Latent Dirichlet Allocation (LDA) with 200 as the total number of topics. The construction of this measure and similar measures for robustness is described in section III. We estimate the specification using a negative binomial estimator due to the count nature of the outcome variable. Treated is a dummy variable that equals 1 if firm j is headquartered in a US state in which the share of local public companies clients of Arthur Andersen (AA) in 2000 was in the top 25% of the distribution, and zero otherwise, in column (1). It is the computed for the Big 5 consulting company listed on top of each column. After 2002_t is a dummy variable that equals 1 if the contract was signed underlying continuous share of public firms in a state that were clients of AA in 2000 in column (5). In other columns, it is the same measures in 2003 or later, and zero otherwise. Please refer to Table 1 for definitions of other variables. We cluster standard errors at the level of state (s). The sample period is from 1994 to 2015.

•		70p 25%	Share AA or Big	or Big 5			Sha	Share AA or E	Big 5	
	Insiders (1)	EY (2)	Deloitte (3)	KPMG (4)	$\begin{array}{c} \text{PWC} \\ (5) \end{array}$	$\frac{\text{Insiders}}{(6)}$	EY (7)	Deloitte (8)	$\begin{array}{c} \text{KPMG} \\ (9) \end{array}$	$\frac{PWC}{(10)}$
Treated \times After 2002	0.037	0.023	-0.109***	-0.058	0.003	0.060	0.409	-1.605***	0.500	0.389
	(6±0.0)	(0.020)	(100.0)	(150.0)	(0.020)	(166:0)	(0.000)	(00±.0)	(0.001)	(0.400)
Year FE	×	×	×	×	X	×	×	×	×	×
Industry FE	×	×	×	×	X	×	×	×	×	×
State FE	×	×	×	×	X	X	×	×	×	×
Controls	×	×	×	×	×	×	×	×	×	×
Z	1766	2772	2772	2772	2772	1766	2772	2772	2772	2772
Pseudo R-sq	0.037	0.031	0.031	0.031	0.031	0.037	0.031	0.031	0.031	0.031

Table 6: Which Clauses Increased Contract Completeness?

This table reports estimates of beta from the following OLS regression equation

 $Y_{i,j,p,k,t} = \alpha + \beta \times After 2002 + X' \times \gamma + \phi_k + \phi_p + \phi_t + \epsilon_{i,j,p,k,t}$

where $Y_{i,j,p,k,t}$ is a dummy variable for whether the topic identified by the LDA procedure listed on top of each column is detected in contract i signed by firm j in industry p and state k as of year t. The words that compose each topic are depicted in Figure 6. Treated is the fraction of public firms in a state that were clients of Author Andersen as of the end of fiscal year 2000 (AA%). Please refer to Table 1 for definitions of other variables. We cluster standard errors at the level of state (k). The sample period is from 1994 to 2015.

	Confidentiality &		Contract	Indemni-	Restrictions	Non-	compete Cla	ruses
	Data Secrecy	Termination	Amendments	fication	to Equity	All	All Enforcement	ement
							High	
	(1)	(2)	(3)	(4)	(5)	(9)	(2)	(8)
Treated \times After 2002	0.077**	0.967	0.570*	0.456*	1.005**	0.503	1.454***	
	(0.035)	(0.445)	(0.321)	(0.281)	(0.415)	(0.951)	(0.201)	
Year FE	×	×	×	×	×	×	×	
Industry FE	×	×	×	×	×	×	×	
State FE	×	×	×	×	×	×	×	
Controls	×	×	×	×	×	×	×	
N	2772	2772	2772	2772	2772	2772	1341	

Online Appendix: Trust and Contracts: Empirical Evidence

Francesco D'Acunto, Jin Xie, and Jiaquan Yao

Not for Publication

Figure A.1: Example of Consulting Contract in Our Sample

EX-10.(HHHH) 10 dex10hhhh.htm CONSULTING AGREEMENT

Exhibit (10)(hhhh)

CONSULTING AGREEMENT

This CONSULTING AGREEMENT ("<u>Agreement</u>"), dated January 13, 2010, by and between The First American Corporation, a California corporation (the "<u>Company</u>"), and Frank V. McMahon ("<u>Consultant</u>"). The parties agree as follows:

- 1. <u>Services</u>. From the date hereof until November 30, 2011 (the "<u>Term</u>"), the Company has retained Consultant to provide, and Consultant agrees to provide, to the Company and its subsidiaries consulting services as reasonably requested by the Company (collectively, the "<u>Services</u>"), including, without limitation, those services as may be requested to transition employee, client, vendor and other relationships to employees of the Company or its subsidiaries and to complete transactions in which the Company or any of its subsidiaries are involved. Consultant shall report to the chairman of the board, the chief executive officer of the Company and their designees (each such individual a "<u>Designated Representative</u>").
- 2. Independent Consultant. Consultant is not an employee or agent of the Company for any purpose. Consultant is an independent Consultant, and he is not eligible to participate in or receive any benefit from any benefit plan, program or other arrangement that may from time to time be available to employees of the Company including, but not limited to, any health, disability, or life insurance, vacation or holiday pay, sick leave, profit sharing or pension plans. The Company will not provide workers' compensation coverage for Consultant. Consultant is solely responsible for payment of all applicable taxes and withholdings respecting all payments made under this Agreement, and for all claims, damages and/or lawsuits arising out of the acts of Consultant and Consultant's employees and agents. The Company shall prepare and file a Form 1099 with respect to the payments made to the Consultant hereunder. Consultant does not have authority to obligate or bind the Company in any way, and he will not attempt to do so. The Company shall reimburse Consultant only for those expenses he incurs in connection with performing the Services that are pre-approved in writing by an officer of the Company. The Company is interested only in the results obtained by Consultant, who shall have sole control of the manner and means of performing under this Agreement.
- 3. <u>Compensation</u>. In consideration for the Services to be rendered by the Consultant hereunder the Company shall pay Consultant the total sum of \$1,058,388.00, payable
 - (a) \$50,000 on May 30, 2010 and
 - (b) provided Consultant has not breached Section 7 of this Agreement:
 - (i) \$479,194.00 on November 30, 2010 and
 - (ii) \$44,099.50 per month on the 30th day of each month (or if not a business day, the immediately preceding business day) commencing December 30, 2010, with the final payment to be paid on November 30, 2011.
- 4. <u>Company Property</u>. All access to and use of Company Property must comply with the Company's policies and procedures, as defined by the Company from time to time.

Consultant agrees to vacate the Company's facilities (if and to the extent Consultant has been provided access thereto) and return all Company Property (if and to the extent Consultant has been provided such property) immediately upon termination of this Agreement for any reason, or sooner upon request by the Company, and Consultant will pay for any damage to Company Property resulting from Consultant's actions and omissions. Consultant will not use any Company Property for any purpose other than providing the Services, without the Company's express prior written consent. For purposes of this Agreement, "Company Property" is the facilities, equipment and other property provided to Consultant for access and/or use in connection with providing the Services.

5. <u>Performance</u>. Consultant agrees to provide the Services with due diligence in compliance with applicable laws and regulations, and in accordance with the highest professional standards of practice in the industry.

Consultant will report to and provide the Services in accordance with the instructions of the Designated Representative. The Company shall have no right to control Consultant in the method for performing the Services.

- 6. Non-Exclusivity of Services. Subject to Section 7, Consultant is free to pursue any and all outside activities and/or employment as Consultant desires, and Company acknowledges that Consultant will likely be involved in other business activities, contracting and/or employment.
- 7. Non-Compete and Non-Solicit. Section 6 of this Agreement notwithstanding, until November 30, 2010, Consultant will not, directly or indirectly, engage in or render any service of a business, commercial or professional nature to any other person, entity or organization, whether for compensation or otherwise, that is, or has indicated an intention to be, a Competitor (as defined below); provided, for the avoidance of doubt, that this Section 7 shall not preclude Consultant from being employed by or rendering services as an advisor to investment banking or private equity firms so long as in the course of such employment or the rendering of such services Consultant does not, directly or indirectly, engage in or render any services of a business, commercial or professional nature to any other person, entity or organization, whether for compensation or otherwise, that is, or has indicated an intention to be, a Competitor. In accordance with this restriction, but without limiting its terms, Consultant will not:
 - (a) be employed by, serve as a director to, consult with or provide advice to or otherwise participate in the operations of any Competitor;
 - (b) solicit customers, business, patronage or orders for, or sell any products or services for any Competitor;
 - (c) divert, entice, or take away, or attempt to divert, entice or take away, any customers, business, patronage or orders of the Company and its subsidiaries for the benefit of or on behalf of any Competitor; or
 - (d) promote or assist, financially or otherwise, any person, firm, association, partnership, corporation or other entity that is a Competitor.

The Company's sole remedy for a breach of this Section 7 shall be termination of the Company's obligation to make further payments of any amount pursuant to Section 3(b) and, for the avoidance of doubt, the Company shall not be entitled to other monetary damages or injunctive relief in the event of any such breach. For the avoidance of doubt, a breach of this Section 7 shall not (i) constitute a breach of that certain Separation Agreement and General Release, dated as of even date herewith, between the Company and Consultant (the "Separation Agreement"), except to the extent that the activity resulting in a breach of this Section 7 would constitute a breach of the Separation Agreement by its terms, (ii) shall have no effect on the vesting of the Bonus RSUs or the Other RSUs granted to Consultant in 2007 (each as defined in the Separation Agreement), except to the extent that the activity resulting in a breach of this Section 7 would constitute a breach of the RSU Agreements (as defined in the Separation Agreement) by their terms, (iii) shall have no effect on the vesting of the Initial RSA (as defined in the Separation Agreement) and (iv) shall have no effect on the exercisability of the Initial Option (as defined in the Separation Agreement)

For purposes of this Section 7, "Competitor" means a person or entity that is engaged in, or has indicated an intention to be engaged in, any of the businesses described in the section captioned "The Information Solutions Group" in Part I, Item 1 of the Company's Annual Report on Form 10-K for the year ended December 31, 2008 (including, without limitation, the subsections captioned as "Information and Outsourcing Solutions Segment", "Data and Analytic Solutions Segment" and "Risk Mitigation and Business Solutions Segment"), excluding amendments to that section, if any, filed after November 30, 2009. The foregoing notwithstanding, no person or entity shall be deemed a "Competitor" as a result of engaging in activities in which the Company was not actually engaged in as of November 30, 2009.

In the event any executive vice president or higher officer of the Company has determined that Consultant has breached this Section 7, the Company will notify McMahon of such breach within 10 business days thereof.

8. Scope of Restricted Activities. For the purposes of Section 7, but without limitation thereof, Consultant will be in violation thereof if Consultant engages in any or all of the activities set forth therein directly as an individual on Consultant's own account, or indirectly as a stockholder, partner, joint venturer, employee, agent, salesperson, consultant, officer and/or director of, or by virtue of the ownership by Consultant's spouse, child or parent of any equity interest in, any firm, association, partnership, corporation or other entity engaging in any or all of such activities; provided, however, Consultant's or Consultant's spouse's, child's or parent's ownership of less than one percent (1%) of the issued equity interest in any publicly traded corporation shall not alone constitute a violation of Section 7 of this Agreement.

9. Additional Covenants.

(a) <u>Detrimental Activity</u>. Until November 30, 2011, Consultant agrees to refrain from engaging in any Detrimental Activity (as defined below). For purposes of this Agreement, "<u>Detrimental Activity</u>" means at any time (i) using information received during employment with the Company and/or its affiliates or during the Term relating to the business affairs of the Company or any such affiliates in breach of an express or implied undertaking to keep such information confidential; (ii) directly or indirectly persuading or attempting to

persuade, by any means, any employee of the Company or any of its affiliates to breach any of the terms of his or her employment with Company or its affiliates; (iii) directly or indirectly making any statement that is, or could be, disparaging of the Company or any of its affiliates or any of their respective employees (except to the extent necessary to respond truthfully to any inquiry from applicable regulatory authorities or to provide information pursuant to legal process); (iv) directly or indirectly engaging in any illegal, unethical or otherwise wrongful activity that is, or could be, substantially injurious to the financial condition, reputation or goodwill of the Company or any of its affiliates; or (v) directly or indirectly engaging in an act of misconduct such as, embezzlement, fraud, dishonesty, nonpayment of any obligation owed to the Company or any of its affiliates, breach of fiduciary duty or disregard or violation of rules, policies or procedures of the Company or any of its affiliates, an unauthorized disclosure of any trade secret or confidential information of the Company or any of its affiliates or inducing any customer to breach a contract with the Company or any of its affiliates. For the avoidance of doubt, the Company and Consultant acknowledge and agree that competing with the Company and/or its affiliates, where such competition does not involve any of the activities described in the immediately preceding sentence of this Section 9(a), shall not constitute Detrimental Activity.

- (b) Non-Solicitation. Until November 30, 2011, Consultant agrees to not directly or indirectly, disrupt, damage, impair or interfere with the Company's or any of its affiliates' business by raiding any of the Company's or such affiliates' employees or soliciting any of them to resign from their employment by the Company or any such affiliate.
- 10. Scope of Covenants. The Company and Consultant acknowledge that the time, scope, and other provisions of Sections 7, 8 and 9 have been specifically negotiated by sophisticated commercial parties and agree that they consider the restrictions and covenants contained in such Sections to be reasonable and necessary for the protection of the interests of the Company, but if any such restriction or covenant shall be held by any court of competent jurisdiction to be void but would be valid if deleted in part or reduced in application, such restriction or covenant shall apply with such deletion or modification as may be necessary to make it valid and enforceable. The restrictions and covenants contained in each provision of such Sections shall be construed as separate and individual restrictions and covenants and shall each be capable of being severed without prejudice to the other restrictions and covenants or to the remaining provisions of this Agreement.
- 11. <u>Trade Secrets and Confidential Information</u>. Consultant acknowledges and agrees that he has learned, obtained, acquired, and become aware of, and will learn, obtain, acquire and become aware of information about the Company, its affiliates and their businesses, including, without limitation, unique selling and servicing methods and business techniques, business strategies, financial information, training, service and business manuals, promotional materials, training courses and other training and instructional materials, vendor and product information, customer and prospective customer lists, other customer and prospective customer information, processes, inventions, patents, copyrights, trademarks and other intellectual property and intangible rights, legal matters, personal information regarding officers and other employees, and other business information (collectively referred to as "Confidential"

<u>Information</u>"). Consultant specifically acknowledges that all such Confidential Information, whether reduced to writing, maintained on any form of electronic media, or maintained in the mind or memory of Consultant

and whether compiled by the Company or any of its affiliates or by Consultant derives independent economic value from not being readily known to or ascertainable by proper means by others who can obtain economic value from its disclosure or use, that reasonable efforts have been made by the Company and its affiliates to maintain the secrecy of such information, that such information is the sole property of the Company or an affiliate of the Company and that any retention and use of such information or rights by Consultant shall constitute a misappropriation of the Company's or its affiliates' trade secrets, rights or other property. Consultant agrees to refrain from disclosing any Confidential Information to any person, either orally or in writing, for any reason. Consultant acknowledges and agrees that any unauthorized disclosure of Confidential Information would cause irreparable harm to the Company and/or its affiliates (at such time or as of the date of this Agreement) and such conduct shall be subject to immediate injunctive relief.

- 12. <u>Assignment</u>. Consultant will not assign, transfer or subcontract any right in or obligation arising under this Agreement without the Company's prior written consent. Any assignment in violation of this paragraph shall be void. This Agreement is binding on and will inure to the benefit of each party's heirs, executors, legal representatives, successors and permitted assigns.
- 13. General. If any provision of this Agreement is deemed unenforceable, such provision shall be severed from this Agreement and the remaining provisions will remain in full force and effect. This Agreement is governed by and will be interpreted in accordance with the laws of the State of California, without regard to the conflicts of law provisions thereof, or of any other State. No modification of this Agreement will be binding upon either party unless made in writing and signed by a duly authorized representative of such party. The failure of the Company to require performance by Consultant of any provision hereof shall not affect the full right to require such performance at any time thereafter; nor shall the waiver by the Company of a breach of any provision hereof by Consultant be taken or held to be a waiver of the provision itself. This Agreement contains the entire agreement and understanding of the parties hereto with respect to the subject matter hereof, and mergers and supercedes all prior agreements, discussions and writings with respect thereto.
- 14. <u>Termination</u>. Consultant may terminate this Agreement at any time upon delivery of written notice to the Company. Upon delivery of such notice, Consultant's and the Company's obligations hereunder, shall terminate and be of no further force and effect; <u>provided</u>, <u>however</u>, that Sections 4, 9, 11, 12, 13 and 14 of this Agreement shall survive any such termination.

BY SIGNING BELOW, THE PARTIES ACKNOWLEDGE THAT THEY HAVE CAREFULLY READ AND UNDERSTAND THE OBLIGATIONS IMPOSED BY THIS AGREEMENT. NO PROMISES OR REPRESENTATIONS HAVE BEEN MADE BY THE PARTIES OTHER THAN AS EXPRESSLY SET FORTH IN THIS AGREEMENT.

IN WITNESS WHEREOF the undersigned have executed this Agreement as of the day and year first written above. The parties hereto agree that facsimile signatures shall be as effective as if originals.

THE FIRST AMERICAN CORPORATION

By: __/s/ Kenneth D. DeGiorgio
Kenneth D. DeGiorgio
Senior Vice President

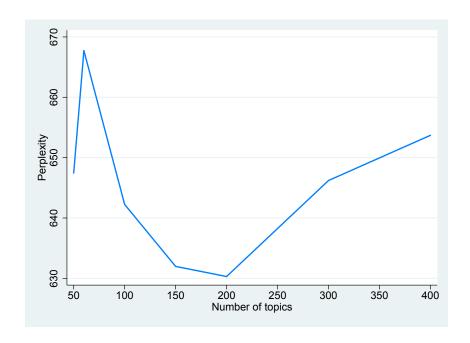
Dated: January 13, 2010

FRANK V. MCMAHON

/s/ Frank V. McMahon

Dated: January 13, 2010

Figure A.2: Optimal Number of Topics under LDA $\,$



 $\begin{tabular}{ll} Figure A.3: Trust or Changing Disclosure Requirements after SOX? Number of Contracts Disclosed Per Firm \\ \end{tabular}$

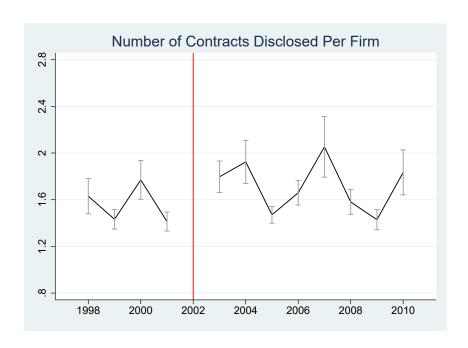


Table A.1: Distribution of Consulting Contracts across Fama-French 49 Industries

This table reports the distribution of consulting contracts across Fama-French 49 industries. Total refers to all contracts signed by companies in an industry. Outsider refers to contracts signed with external consultants. Insider refers to contracts signed with internal consultants. Public refers to contracts signed between publicly listed firms and any consultants. Private refers to contracts signed between private firms with SEC registration and any consultants. Min Yr and Max Yr refer to the earliest and latest years in which a contract is signed. 8K refers to contracts disclosed to investors as a specific corporate event.

	Total	Outsider	Insider	Public	Private	Min Yr	Max Yr	8-K
Agriculture	15	8	7	15	0	1995	2012	6
Food Products	64	40	24	56	8	1993	2015	21
Candy & Soda	16	10	6	11	5	1996	2014	5
Beer & Liquor	23	16	7	9	14	1994	2011	12
Tobacco Products	6	1	5	4	2	2002	2014	4
Recreation	43	32	11	30	13	1995	2015	6
Entertainment	161	120	41	119	42	1993	2015	48
Printing and Publishing	27	21	6	25	2	1996	2011	2
Consumer Goods	94	75	19	68	26	1992	2014	19
Apparel	42	24	18	35	7	1995	2015	13
Healthcare	116	83	33	102	14	1990	2015	30
Medical Equipment	216	149	67	175	41	1993	2015	76
Pharmaceutical Products	714	513	201	550	164	1995	2015	255
Chemicals	88	49	39	70	18	1993	2015	25
Rubber and Plastic Products	46	35	11	29	17	1995	2013	17
Textiles	30	19	11	19	11	1994	2009	4
Construction Materials	68	31	37	59	9	1994	2013	17
Construction	58	39	19	48	10	1995	2014	20
Steel Works Etc	64	26	38	53	11	1994	2015	26
Fabricated Products	14	3	11	13	1	1995	2015	4
Machinery	159	99	60	122	37	1991	2015	54
Electrical Equipment	99	76	23	78	21	1993	2014	40
Automobiles and Trucks	68	46	22	47	21	1993	2014	18
Aircraft	35	15	20	31	4	1996	2014	13
Shipbuilding, Railroad Equipment	14	8	6	8	6	1993	2013	2
Defense	13	7	6	11	$\overset{\circ}{2}$	1994	2011	0
Precious Metals	45	37	8	28	17	1993	2015	17
Non-Metallic and Industrial Metal Mining	101	83	18	40	61	1996	2014	59
Coal	17	12	5	12	5	1996	2014	7
Petroleum and Natural Gas	295	204	91	189	106	1993	2015	124
Utilities	133	59	74	117	16	1993	2015	25
Communication	172	118	54	110	62	1993	2015	59
Personal Services	93	43	50	79	14	1995	2014	15
Business Services	895	660	235	636	259	1994	2015	293
Computers	190	138	52	165	25	1994	2015	50
Electronic Equipment	227	155	72	193	34	1995	2015	56
Measuring and Control Equipment	95	66	29	74	21	1994	2015	20
Business Supplies	25	7	18	23	2	1994	2014	3
Shipping Containers	9	2	7	5	4	1997	2005	1
Transportation	105	55	50	90	15	1996	2014	20
Wholesale	154	106	48	112	42	1992	2015	65
Retail	219	140	48 79	165	54	1994	2015	62
Restaraunts, Hotels, Motels	79	45	34	71	8	1994	2015	18
Banking	268	45 115	153	235	33	1994	2015	94
Insurance	208 99	49	195 50	233 93	ээ 6	1995 1995	$\frac{2015}{2015}$	94 27
Real Estate	99 57	49 45	30 12	93 49	8	1993	2013	27 17
	283	206	12 77	49 229	6 54	1993 1994	2015	94
Trading	$\frac{283}{227}$							-
Almost Nothing	441	177	50	169	58	1993	2015	73

Table A.2: Distribution of Consulting Contracts across States

This table reports the distribution of consulting contracts across states. Total refers to the total number of contracts signed by companies in an industry. Outsider refers to contracts signed between companies and external consultants. Insider refers to contracts signed between companies and internal consultants. Public refers to contracts signed between publicly listed firms and consultants. Private refers to contracts signed between private firms with SEC registration and any consultants. Min Yr and Max Yr refer to the earlies and latest years in which a contract is signed. 8K refers to contracts disclosed to investors as a specific corporate event.

	Total	Outsider	Insider	Public	Private	Min Yr	Max Yr	8K
Alabama	21	12	9	21	Tilvate	1995	2014	4
Arizona	$\frac{21}{121}$	96	$\frac{3}{25}$	72	49	1988	2014	42
Arkansas	18	18	20	11	7	1999	2013	5
California	1195	819	376	922	273	1984	2014	368
Colorado	183	127	56	135	48	1994	2015	73
Connecticut	115	75	40	101	46 14	1989	2015 2015	31
Delaware	15	8	7	12	3	1995	2015	5
District of Columbia	6	3	3	6	3	2001	2013	2
Florida					171			
	455	348	107	284	171	1992	2015	126
Georgia	189	131	58 7	155	34	1991	2015	61
Hawaii	16	9		12	4	1997	2015	6
Idaho	9	7	2	7	2	2001	2014	4
Illinois	210	126	84	166	44	1991	2015	61
Indiana	45	24	21	36	9	1995	2014	13
Iowa	13	7	6	13		1993	2014	2
Kansas	27	11	16	23	4	1996	2015	12
Kentucky	24	15	9	16	8	1994	2015	9
Louisiana	30	16	14	26	4	1995	2015	10
Maine	8	7	1	8		1995	2015	1
Maryland	82	53	29	73	9	1994	2014	31
Massachusetts	261	173	88	224	37	1981	2015	72
Michigan	93	51	42	76	17	1988	2014	26
Minnesota	107	73	34	100	7	1993	2015	22
Mississippi	11	8	3	8	3	1995	2013	1
Missouri	75	41	34	58	17	1992	2014	17
Montana	4	4		4		1996	2008	3
Nebraska	17	9	8	13	4	1997	2014	3
Nevada	202	175	27	99	103	1996	2015	80
New Hampshire	16	10	6	16		1995	2012	0
New Jersey	267	195	72	192	75	1990	2015	93
New Mexico	17	12	5	11	6	1995	2015	5
New York	541	366	175	415	126	1982	2015	177
North Carolina	121	68	53	99	22	1993	2014	41
North Dakota	1		1	1		2007	2015	0
Ohio	108	63	45	100	8	1985	2015	27
Oklahoma	25	9	16	22	3	1995	2013	5
Oregon	63	44	19	58	5	1995	2015	18
Pennsylvania	196	100	96	163	33	1993	2015	54
Rhode Island	27	22	5	9	18	1995	2009	8
South Carolina	47	43	4	26	21	1995	2014	15
South Dakota	8	7	1	7	1	2000	2010	3
Tennessee	55	22	33	53	2	1995	2014	12
Texas	657	421	236	522	135	1991	2015	262
Utah	73	49	24	58	15	1994	2015	28
Vermont	2	1	1	2		1999	2008	1
Virginia	123	78	45	109	14	1994	2014	43
Washington	113	90	23	63	50	1995	2014	31
West Virginia	6	2	4	4	2	2002	2014	2
Wisconsin	57	13	44	54	3	1994	2013	21
Wyoming	6	6		6	J	2005	2014	0
,, younng	J			J		2000	2014	J

Table A.3: Spatial Distribution of Big Five Clients across States as of 2000

This table reports the distribution of big five's client shares of across states. AA% is the fraction of public firms in a state that were clients of Author Anderson as of the end of fiscal year 2000. EY%, Deloitte%, PWC% and KPMG% are the fraction of public firms in a state that were clients of Ernst & Young, Deloitte, PricewaterhouseCooper, and KPMG, respectively, as of the end of fiscal year 2000.

AA% EY% Deloitte% KPMG% PWC% N Alabama 0.000 0.000 0.033 3.33 0.00 3 Alabama 0.246 0.197 0.115 0.049 0.213 61 Arkanasas 0.212 0.242 0.121 0.091 0.159 0.167 0.127 0.159 0.167 0.127 0.159 0.167 0.127 0.159 0.167 0.127 0.159 0.167 0.127 0.159 0.168 0.161 0.069 0.120 0.511 0.159 0.163 0.151 0.0129 0.033 0.252 0.013 29 Delaware 0.022 0.163 0.511 0.109 0.108 0.08 286 Hawaii 0.105 0.211 0.112 0.112 0.125 516 Georgia 0.261 0.140 0.209 0.302 0.00 43 Idawaii 0.163 0.200 0.188 0.63 0.318 16 </th <th></th> <th></th> <th></th> <th></th> <th></th> <th></th> <th></th>							
Alabama 0.246 0.197 0.115 0.049 0.213 61 Arkansas 0.212 0.242 0.121 0.091 0.030 33 Arizona 0.159 0.167 0.127 0.159 0.119 1.25 California 0.096 0.201 0.119 0.120 0.200 1574 Colorado 0.188 0.119 0.085 0.138 0.158 257 Connecticut 0.143 0.153 0.089 0.172 0.212 201 District of Columbia 0.333 0.133 0.033 0.29 0.108 0.08 286 Georgia 0.221 0.163 0.511 0.109 0.130 92 Florida 0.100 0.114 0.112 0.122 0.108 206 Georgia 0.261 0.150 0.129 0.108 206 Hawaii 0.106 0.140 0.100 0.316 0.105 19 Iowa 0.14		AA%	EY%	Deloitte%	KPMG%	PWC%	N
Arkansas 0.212 0.242 0.121 0.091 0.303 33 Arizona 0.159 0.167 0.127 0.159 0.119 1.26 California 0.096 0.201 0.119 0.120 0.200 1574 Colorado 0.188 0.119 0.085 0.138 0.158 257 Connecticut 0.148 0.153 0.089 0.172 0.212 201 District of Columbia 0.333 0.153 0.033 0.200 0.033 29 Delaware 0.022 0.163 0.511 0.109 0.130 92 Florida 0.110 0.114 0.112 0.112 0.108 286 Hawaii 0.105 0.211 0.105 0.316 0.105 119 Iowa 0.140 0.120 0.018 0.063 0.010 18 Idaho 0.105 0.211 0.105 0.316 0.105 127 516 Georgia			0.000	0.333	0.333		
Arizona 0.159 0.167 0.127 0.159 0.119 126 California 0.096 0.201 0.119 0.120 0.200 1574 Colorado 0.188 0.119 0.085 0.138 0.158 257 Connecticut 0.143 0.153 0.089 0.172 0.212 201 District of Columbia 0.333 0.133 0.033 0.200 0.033 29 Plorida 0.110 0.114 0.112 0.129 0.108 0.108 286 Hawaii 0.105 0.211 0.105 0.316 0.105 19 Iowa 0.140 0.140 0.140 0.129 0.108 0.108 286 Hawaii 0.105 0.211 0.105 0.316 0.105 19 Iowa 0.140 0.140 0.140 0.129 0.108 0.000 433 Idaho 0.063 0.000 0.188 0.063 0.313 16 <td></td> <td>-</td> <td></td> <td></td> <td></td> <td></td> <td></td>		-					
California 0.096 0.201 0.119 0.120 0.200 1574 Colorado 0.188 0.119 0.085 0.138 0.158 257 Connecticut 0.143 0.153 0.089 0.172 0.212 201 District of Columbia 0.333 0.133 0.033 0.200 0.033 29 Florida 0.110 0.114 0.112 0.109 0.130 92 Florida 0.101 0.114 0.112 0.112 0.127 516 Georgia 0.261 0.150 0.129 0.108 0.08 Hawaii 0.105 0.211 0.105 0.316 0.105 19 Iowa 0.140 0.140 0.209 0.302 0.000 43 Idaho 0.105 0.212 0.106 0.313 16 Illinois 0.161 0.289 0.126 0.134 0.128 453 Indian 0.162 0.181 0.000<							
Colorado 0.188 0.119 0.085 0.138 0.158 257 Connecticut 0.143 0.153 0.089 0.172 0.212 201 District of Columbia 0.333 0.133 0.033 0.200 0.033 29 Delaware 0.022 0.163 0.511 0.109 0.130 92 Florida 0.110 0.114 0.112 0.112 0.127 516 Georgia 0.261 0.150 0.129 0.108 0.168 286 Hawaii 0.105 0.211 0.105 0.316 0.105 19 Iowa 0.140 0.140 0.209 0.302 0.000 43 Idaho 0.063 0.000 0.188 0.063 0.313 16 Illinois 0.161 0.289 0.126 0.134 0.128 453 Indiana 0.107 0.191 0.122 0.061 0.160 0.31 16 Illindiana <td></td> <td></td> <td></td> <td></td> <td></td> <td></td> <td></td>							
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Delaware				0.089			
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Georgia 0.261 0.150 0.129 0.108 0.108 286 Hawaii 0.105 0.211 0.105 0.316 0.105 19 Iowa 0.140 0.140 0.209 0.302 0.000 43 Idaho 0.063 0.000 0.188 0.663 0.313 16 Illinois 0.161 0.289 0.126 0.134 0.128 453 Indiana 0.107 0.191 0.122 0.061 0.160 131 Kansas 0.182 0.145 0.091 0.218 0.073 55 Kentucky 0.148 0.180 0.049 0.115 0.161 56 Kentucky 0.148 0.180 0.049 0.115 0.161 56 Massachusetts 0.186 0.115 0.140 0.105 0.272 511 Maryland 0.172 0.178 0.080 0.092 0.161 172 Maine 0.154							
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Iowa 0.140 0.140 0.209 0.302 0.000 43 Idaho 0.063 0.000 0.188 0.063 0.313 16 Illinois 0.161 0.289 0.126 0.134 0.128 453 Indiana 0.107 0.191 0.122 0.061 0.160 131 Kansas 0.182 0.145 0.091 0.218 0.073 55 Kentucky 0.148 0.180 0.049 0.115 0.164 61 Louisiana 0.232 0.143 0.143 0.054 0.161 56 Massachusetts 0.186 0.115 0.140 0.105 0.272 511 Maryland 0.172 0.178 0.080 0.092 0.161 172 Maine 0.154 0.000 0.000 0.000 0.36 0.163 166 Michigan 0.151 0.139 0.163 0.036 0.163 166 Minchigan	0						
Idaho				0.105			
Illinois		0.140	0.140	0.209	0.302	0.000	
Indiana		0.063	0.000	0.188	0.063	0.313	
Kansas 0.182 0.145 0.091 0.218 0.073 55 Kentucky 0.148 0.180 0.049 0.115 0.164 61 Louisiana 0.232 0.143 0.143 0.054 0.161 56 Massachusetts 0.186 0.115 0.140 0.105 0.272 511 Maryland 0.172 0.178 0.080 0.092 0.161 172 Maine 0.154 0.000 0.000 0.000 0.036 0.163 166 Minesotra 0.147 0.228 0.095 0.129 0.125 231 Missouri 0.104 0.167 0.132 0.181 0.236 144 Mississippi 0.194 0.167 0.132 0.181 0.236 144 North Carolina 0.091 0.210 0.140 0.124 0.226 186 North Dakota 0.429 0.143 0.000 0.000 0.000 0.000 7 <td></td> <td></td> <td></td> <td></td> <td></td> <td></td> <td></td>							
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Louisiana 0.232 0.143 0.143 0.054 0.161 56 Massachusetts 0.186 0.115 0.140 0.105 0.272 511 Maryland 0.172 0.178 0.080 0.092 0.161 172 Maine 0.154 0.000 0.000 0.000 0.385 16 Minesota 0.151 0.139 0.163 0.036 0.163 16 Minnesota 0.147 0.228 0.095 0.129 0.125 231 Missouri 0.104 0.167 0.132 0.181 0.236 144 Mississisppi 0.194 0.194 0.065 0.129 0.129 31 Montana 0.000 0.071 0.071 0.214 0.286 14 North Carolina 0.091 0.210 0.140 0.124 0.226 186 North Dakota 0.429 0.143 0.000 0.000 0.000 0.000 7 New Jersey	Kansas	0.182	0.145	0.091	0.218	0.073	55
Massachusetts 0.186 0.115 0.140 0.105 0.272 511 Maryland 0.172 0.178 0.080 0.092 0.161 172 Maine 0.154 0.000 0.000 0.000 0.385 13 Michigan 0.151 0.139 0.163 0.036 0.163 166 Minnesota 0.147 0.228 0.095 0.129 0.125 231 Missouri 0.104 0.167 0.132 0.181 0.236 144 Mississisppi 0.194 0.194 0.065 0.129 0.129 31 Montana 0.000 0.071 0.071 0.214 0.226 186 North Carolina 0.091 0.210 0.140 0.124 0.226 186 North Dakota 0.429 0.143 0.000 0.000 0.000 7 Nebraska 0.030 0.000 0.424 0.182 0.121 33 New Hampshire	Kentucky	0.148	0.180	0.049	0.115	0.164	61
Maryland 0.172 0.178 0.080 0.092 0.161 172 Maine 0.154 0.000 0.000 0.000 0.385 13 Michigan 0.151 0.139 0.163 0.036 0.163 166 Minnesota 0.147 0.228 0.095 0.129 0.125 231 Missouri 0.104 0.167 0.132 0.181 0.236 144 Mississippi 0.194 0.194 0.065 0.129 0.129 31 Montana 0.000 0.071 0.071 0.214 0.286 14 North Carolina 0.091 0.210 0.140 0.124 0.226 186 North Dakota 0.429 0.143 0.000 0.000 0.000 7 Nebraska 0.030 0.000 0.424 0.182 0.121 33 New Hampshire 0.176 0.147 0.176 0.118 0.118 0.118 0.18 <td< td=""><td>Louisiana</td><td>0.232</td><td>0.143</td><td>0.143</td><td>0.054</td><td>0.161</td><td>56</td></td<>	Louisiana	0.232	0.143	0.143	0.054	0.161	56
Maine 0.154 0.000 0.000 0.000 0.385 13 Michigan 0.151 0.139 0.163 0.036 0.163 166 Minnesota 0.147 0.228 0.095 0.129 0.125 231 Missouri 0.104 0.167 0.132 0.181 0.236 144 Mississippi 0.194 0.194 0.065 0.129 0.129 31 Montana 0.000 0.071 0.071 0.214 0.286 14 North Carolina 0.091 0.210 0.140 0.124 0.226 186 North Dakota 0.429 0.143 0.000 0.000 0.000 7 Nebraska 0.030 0.000 0.424 0.182 0.121 33 New Hampshire 0.176 0.147 0.176 0.118 0.118 0.118 33 New Mexico 0.111 0.000 0.000 0.167 0.056 18	Massachusetts	0.186	0.115	0.140	0.105	0.272	511
Michigan 0.151 0.139 0.163 0.036 0.163 166 Minnesota 0.147 0.228 0.095 0.129 0.125 231 Missouri 0.104 0.167 0.132 0.181 0.236 144 Mississippi 0.194 0.194 0.065 0.129 0.129 31 Montana 0.000 0.071 0.071 0.214 0.286 14 North Carolina 0.091 0.210 0.140 0.124 0.226 186 North Dakota 0.429 0.143 0.000 0.000 0.000 0.000 7 Nebraska 0.030 0.000 0.424 0.182 0.121 33 New Hampshire 0.176 0.147 0.176 0.118 0.118 33 New Jersey 0.122 0.118 0.150 0.122 0.127 428 New Mexico 0.111 0.000 0.000 0.167 0.056 18	Maryland	0.172	0.178	0.080	0.092	0.161	172
Minnesota 0.147 0.228 0.095 0.129 0.125 231 Missouri 0.104 0.167 0.132 0.181 0.236 144 Mississippi 0.194 0.194 0.065 0.129 0.129 31 Montana 0.000 0.071 0.071 0.214 0.286 14 North Carolina 0.091 0.210 0.140 0.124 0.226 186 North Dakota 0.429 0.143 0.000 0.000 0.000 0.000 0.000 7 Nebraska 0.030 0.000 0.424 0.182 0.121 33 New Hampshire 0.176 0.147 0.176 0.118 0.118 0.118 33 New Jersey 0.122 0.118 0.150 0.122 0.127 428 New Mexico 0.111 0.000 0.000 0.167 0.056 18 New York 0.096 0.141 0.117 0.127 0.202	Maine	0.154	0.000	0.000	0.000	0.385	13
Missouri 0.104 0.167 0.132 0.181 0.236 144 Mississippi 0.194 0.194 0.065 0.129 0.129 31 Montana 0.000 0.071 0.071 0.214 0.286 14 North Carolina 0.091 0.210 0.140 0.124 0.226 186 North Dakota 0.429 0.143 0.000 0.000 0.000 7 Nebraska 0.030 0.000 0.424 0.182 0.121 33 New Hampshire 0.176 0.147 0.176 0.118 0.118 33 New Jersey 0.122 0.118 0.150 0.122 0.127 428 New Mexico 0.111 0.000 0.000 0.167 0.056 18 Nevada 0.173 0.055 0.197 0.047 0.047 125 New York 0.096 0.141 0.117 0.127 0.202 957 Ohio <t< td=""><td>Michigan</td><td>0.151</td><td>0.139</td><td>0.163</td><td>0.036</td><td>0.163</td><td>166</td></t<>	Michigan	0.151	0.139	0.163	0.036	0.163	166
Mississippi 0.194 0.194 0.065 0.129 0.129 31 Montana 0.000 0.071 0.071 0.214 0.286 14 North Carolina 0.091 0.210 0.140 0.124 0.226 186 North Dakota 0.429 0.143 0.000 0.000 0.000 7 Nebraska 0.030 0.000 0.424 0.182 0.121 33 New Hampshire 0.176 0.147 0.176 0.118 0.118 31 New Jersey 0.122 0.118 0.150 0.122 0.127 428 New Mexico 0.111 0.000 0.000 0.167 0.056 18 Nevada 0.173 0.055 0.197 0.047 0.047 125 New York 0.096 0.141 0.117 0.127 0.202 957 Ohio 0.132 0.225 0.142 0.076 0.175 302 Oklahoma <t< td=""><td>Minnesota</td><td>0.147</td><td>0.228</td><td>0.095</td><td>0.129</td><td>0.125</td><td>231</td></t<>	Minnesota	0.147	0.228	0.095	0.129	0.125	231
Montana 0.000 0.071 0.071 0.214 0.286 14 North Carolina 0.091 0.210 0.140 0.124 0.226 186 North Dakota 0.429 0.143 0.000 0.000 0.000 7 Nebraska 0.030 0.000 0.424 0.182 0.121 33 New Hampshire 0.176 0.147 0.176 0.118 0.118 33 New Jersey 0.122 0.118 0.150 0.122 0.127 428 New Mexico 0.111 0.000 0.000 0.167 0.056 18 New York 0.096 0.141 0.117 0.127 0.202 957 Ohio 0.132 0.225 0.142 0.076 0.175 302 Oklahoma 0.194 0.222 0.097 0.111 0.069 72 Oregon 0.169 0.034 0.157 0.169 0.191 89 Pennsylvania <t< td=""><td>Missouri</td><td>0.104</td><td>0.167</td><td>0.132</td><td>0.181</td><td>0.236</td><td>144</td></t<>	Missouri	0.104	0.167	0.132	0.181	0.236	144
North Carolina 0.091 0.210 0.140 0.124 0.226 186 North Dakota 0.429 0.143 0.000 0.000 0.000 7 Nebraska 0.030 0.000 0.424 0.182 0.121 33 New Hampshire 0.176 0.147 0.176 0.118 0.118 33 New Jersey 0.122 0.118 0.150 0.122 0.127 428 New Mexico 0.111 0.000 0.000 0.167 0.056 18 New York 0.096 0.141 0.117 0.127 0.047 0.047 125 New York 0.096 0.141 0.117 0.127 0.202 957 Ohio 0.132 0.225 0.142 0.076 0.175 302 Oklahoma 0.194 0.222 0.097 0.111 0.069 72 Oregon 0.169 0.034 0.157 0.169 0.191 89 Pen	Mississippi	0.194	0.194	0.065	0.129	0.129	31
North Dakota 0.429 0.143 0.000 0.000 0.000 7 Nebraska 0.030 0.000 0.424 0.182 0.121 33 New Hampshire 0.176 0.147 0.176 0.118 0.118 0.118 33 New Jersey 0.122 0.118 0.150 0.122 0.127 428 New Mexico 0.111 0.000 0.000 0.167 0.056 18 New Ada 0.173 0.055 0.197 0.047 0.047 125 New York 0.096 0.141 0.117 0.127 0.202 957 Ohio 0.132 0.225 0.142 0.076 0.175 302 Oklahoma 0.194 0.222 0.097 0.111 0.069 72 Oregon 0.169 0.034 0.157 0.169 0.191 89 Pennsylvania 0.161 0.166 0.100 0.110 0.208 414 Rhode	Montana	0.000	0.071	0.071	0.214	0.286	14
Nebraska 0.030 0.000 0.424 0.182 0.121 33 New Hampshire 0.176 0.147 0.176 0.118 0.118 33 New Jersey 0.122 0.118 0.150 0.122 0.127 428 New Mexico 0.111 0.000 0.000 0.167 0.056 18 New Ada 0.173 0.055 0.197 0.047 0.047 125 New York 0.096 0.141 0.117 0.127 0.202 957 Ohio 0.132 0.225 0.142 0.076 0.175 302 Oklahoma 0.194 0.222 0.097 0.111 0.069 72 Oregon 0.169 0.034 0.157 0.169 0.191 89 Pennsylvania 0.161 0.166 0.100 0.110 0.208 414 Rhode Island 0.207 0.207 0.069 0.276 0.069 29 South Carolina	North Carolina	0.091	0.210	0.140	0.124	0.226	186
New Hampshire 0.176 0.147 0.176 0.118 0.118 33 New Jersey 0.122 0.118 0.150 0.122 0.127 428 New Mexico 0.111 0.000 0.000 0.167 0.056 18 New Yorkada 0.173 0.055 0.197 0.047 0.047 125 New York 0.096 0.141 0.117 0.127 0.202 957 Ohio 0.132 0.225 0.142 0.076 0.175 302 Oklahoma 0.194 0.222 0.097 0.111 0.069 72 Oregon 0.169 0.034 0.157 0.169 0.191 89 Pennsylvania 0.161 0.166 0.100 0.110 0.208 414 Rhode Island 0.207 0.207 0.069 0.276 0.069 29 South Carolina 0.034 0.119 0.169 0.220 0.085 59 South Dakota	North Dakota	0.429	0.143	0.000	0.000	0.000	7
New Jersey 0.122 0.118 0.150 0.122 0.127 428 New Mexico 0.111 0.000 0.000 0.167 0.056 18 New Ada 0.173 0.055 0.197 0.047 0.047 125 New York 0.096 0.141 0.117 0.127 0.202 957 Ohio 0.132 0.225 0.142 0.076 0.175 302 Oklahoma 0.194 0.222 0.097 0.111 0.069 72 Oregon 0.169 0.034 0.157 0.169 0.191 89 Pennsylvania 0.161 0.166 0.100 0.110 0.208 414 Rhode Island 0.207 0.207 0.069 0.276 0.069 29 South Carolina 0.034 0.119 0.169 0.220 0.085 59 South Dakota 0.333 0.000 0.000 0.000 0.167 12 Tennessee	Nebraska	0.030	0.000	0.424	0.182	0.121	33
New Mexico 0.111 0.000 0.000 0.167 0.056 18 Nevada 0.173 0.055 0.197 0.047 0.047 125 New York 0.096 0.141 0.117 0.127 0.202 957 Ohio 0.132 0.225 0.142 0.076 0.175 302 Oklahoma 0.194 0.222 0.097 0.111 0.069 72 Oregon 0.169 0.034 0.157 0.169 0.191 89 Pennsylvania 0.161 0.166 0.100 0.110 0.208 414 Rhode Island 0.207 0.207 0.069 0.276 0.069 29 South Carolina 0.034 0.119 0.169 0.220 0.085 59 South Dakota 0.333 0.000 0.000 0.000 0.167 12 Tennessee 0.209 0.235 0.113 0.096 0.174 115 Texas 0.	New Hampshire	0.176	0.147	0.176	0.118	0.118	33
Nevada 0.173 0.055 0.197 0.047 0.047 125 New York 0.096 0.141 0.117 0.127 0.202 957 Ohio 0.132 0.225 0.142 0.076 0.175 302 Oklahoma 0.194 0.222 0.097 0.111 0.069 72 Oregon 0.169 0.034 0.157 0.169 0.191 89 Pennsylvania 0.161 0.166 0.100 0.110 0.208 414 Rhode Island 0.207 0.207 0.069 0.276 0.069 29 South Carolina 0.034 0.119 0.169 0.220 0.085 59 South Dakota 0.333 0.000 0.000 0.000 0.167 12 Tennessee 0.209 0.235 0.113 0.096 0.174 115 Texas 0.164 0.179 0.118 0.148 0.151 865 Utah 0.167 </td <td>New Jersey</td> <td>0.122</td> <td>0.118</td> <td>0.150</td> <td>0.122</td> <td>0.127</td> <td>428</td>	New Jersey	0.122	0.118	0.150	0.122	0.127	428
New York 0.096 0.141 0.117 0.127 0.202 957 Ohio 0.132 0.225 0.142 0.076 0.175 302 Oklahoma 0.194 0.222 0.097 0.111 0.069 72 Oregon 0.169 0.034 0.157 0.169 0.191 89 Pennsylvania 0.161 0.166 0.100 0.110 0.208 414 Rhode Island 0.207 0.207 0.069 0.276 0.069 29 South Carolina 0.034 0.119 0.169 0.220 0.085 59 South Dakota 0.333 0.000 0.000 0.000 0.167 12 Tennessee 0.209 0.235 0.113 0.096 0.174 115 Texas 0.164 0.179 0.118 0.148 0.151 865 Utah 0.167 0.147 0.059 0.069 0.088 100 Virginia 0.183	New Mexico	0.111	0.000	0.000	0.167	0.056	18
Ohio 0.132 0.225 0.142 0.076 0.175 302 Oklahoma 0.194 0.222 0.097 0.111 0.069 72 Oregon 0.169 0.034 0.157 0.169 0.191 89 Pennsylvania 0.161 0.166 0.100 0.110 0.208 414 Rhode Island 0.207 0.207 0.069 0.276 0.069 29 South Carolina 0.034 0.119 0.169 0.220 0.085 59 South Dakota 0.333 0.000 0.000 0.000 0.167 12 Tennessee 0.209 0.235 0.113 0.096 0.174 115 Texas 0.164 0.179 0.118 0.148 0.151 865 Utah 0.167 0.147 0.059 0.069 0.088 100 Virginia 0.183 0.152 0.101 0.148 0.125 256 Vermont 0.467<	Nevada	0.173	0.055	0.197	0.047	0.047	125
Oklahoma 0.194 0.222 0.097 0.111 0.069 72 Oregon 0.169 0.034 0.157 0.169 0.191 89 Pennsylvania 0.161 0.166 0.100 0.110 0.208 414 Rhode Island 0.207 0.207 0.069 0.276 0.069 29 South Carolina 0.034 0.119 0.169 0.220 0.085 59 South Dakota 0.333 0.000 0.000 0.000 0.167 12 Tennessee 0.209 0.235 0.113 0.096 0.174 115 Texas 0.164 0.179 0.118 0.148 0.151 865 Utah 0.167 0.147 0.059 0.069 0.088 100 Virginia 0.183 0.152 0.101 0.148 0.125 256 Vermont 0.467 0.067 0.067 0.067 0.067 0.194 165 Wisco	New York	0.096	0.141	0.117	0.127	0.202	957
Oregon 0.169 0.034 0.157 0.169 0.191 89 Pennsylvania 0.161 0.166 0.100 0.110 0.208 414 Rhode Island 0.207 0.207 0.069 0.276 0.069 29 South Carolina 0.034 0.119 0.169 0.220 0.085 59 South Dakota 0.333 0.000 0.000 0.000 0.167 12 Tennessee 0.209 0.235 0.113 0.096 0.174 115 Texas 0.164 0.179 0.118 0.148 0.151 865 Utah 0.167 0.147 0.059 0.069 0.088 100 Virginia 0.183 0.152 0.101 0.148 0.125 256 Vermont 0.467 0.067 0.067 0.067 0.067 0.067 15 Washington 0.139 0.145 0.164 0.115 0.194 165 Wis	Ohio	0.132	0.225	0.142	0.076	0.175	302
Pennsylvania 0.161 0.166 0.100 0.110 0.208 414 Rhode Island 0.207 0.207 0.069 0.276 0.069 29 South Carolina 0.034 0.119 0.169 0.220 0.085 59 South Dakota 0.333 0.000 0.000 0.000 0.167 12 Tennessee 0.209 0.235 0.113 0.096 0.174 115 Texas 0.164 0.179 0.118 0.148 0.151 865 Utah 0.167 0.147 0.059 0.069 0.088 100 Virginia 0.183 0.152 0.101 0.148 0.125 256 Vermont 0.467 0.067 0.067 0.067 0.067 0.067 15 Washington 0.139 0.145 0.164 0.115 0.194 165 Wisconsin 0.234 0.207 0.135 0.063 0.216 110 <td< td=""><td>Oklahoma</td><td>0.194</td><td>0.222</td><td>0.097</td><td>0.111</td><td>0.069</td><td>72</td></td<>	Oklahoma	0.194	0.222	0.097	0.111	0.069	72
Rhode Island 0.207 0.207 0.069 0.276 0.069 29 South Carolina 0.034 0.119 0.169 0.220 0.085 59 South Dakota 0.333 0.000 0.000 0.000 0.167 12 Tennessee 0.209 0.235 0.113 0.096 0.174 115 Texas 0.164 0.179 0.118 0.148 0.151 865 Utah 0.167 0.147 0.059 0.069 0.088 100 Virginia 0.183 0.152 0.101 0.148 0.125 256 Vermont 0.467 0.067 0.067 0.067 0.067 0.067 15 Washington 0.139 0.145 0.164 0.115 0.194 165 Wisconsin 0.234 0.207 0.135 0.063 0.216 110 West Virginia 0.059 0.471 0.059 0.000 0.118 17	Oregon	0.169	0.034	0.157	0.169	0.191	89
South Carolina 0.034 0.119 0.169 0.220 0.085 59 South Dakota 0.333 0.000 0.000 0.000 0.167 12 Tennessee 0.209 0.235 0.113 0.096 0.174 115 Texas 0.164 0.179 0.118 0.148 0.151 865 Utah 0.167 0.147 0.059 0.069 0.088 100 Virginia 0.183 0.152 0.101 0.148 0.125 256 Vermont 0.467 0.067 0.067 0.067 0.067 0.067 15 Washington 0.139 0.145 0.164 0.115 0.194 165 Wisconsin 0.234 0.207 0.135 0.063 0.216 110 West Virginia 0.059 0.471 0.059 0.000 0.118 17	Pennsylvania	0.161	0.166	0.100	0.110	0.208	414
South Dakota 0.333 0.000 0.000 0.000 0.167 12 Tennessee 0.209 0.235 0.113 0.096 0.174 115 Texas 0.164 0.179 0.118 0.148 0.151 865 Utah 0.167 0.147 0.059 0.069 0.088 100 Virginia 0.183 0.152 0.101 0.148 0.125 256 Vermont 0.467 0.067 0.067 0.067 0.067 15 Washington 0.139 0.145 0.164 0.115 0.194 165 Wisconsin 0.234 0.207 0.135 0.063 0.216 110 West Virginia 0.059 0.471 0.059 0.000 0.118 17	Rhode Island	0.207	0.207	0.069	0.276	0.069	29
Tennessee 0.209 0.235 0.113 0.096 0.174 115 Texas 0.164 0.179 0.118 0.148 0.151 865 Utah 0.167 0.147 0.059 0.069 0.088 100 Virginia 0.183 0.152 0.101 0.148 0.125 256 Vermont 0.467 0.067 0.067 0.067 0.067 15 Washington 0.139 0.145 0.164 0.115 0.194 165 Wisconsin 0.234 0.207 0.135 0.063 0.216 110 West Virginia 0.059 0.471 0.059 0.000 0.118 17	South Carolina	0.034	0.119	0.169	0.220	0.085	59
Texas 0.164 0.179 0.118 0.148 0.151 865 Utah 0.167 0.147 0.059 0.069 0.088 100 Virginia 0.183 0.152 0.101 0.148 0.125 256 Vermont 0.467 0.067 0.067 0.067 0.067 15 Washington 0.139 0.145 0.164 0.115 0.194 165 Wisconsin 0.234 0.207 0.135 0.063 0.216 110 West Virginia 0.059 0.471 0.059 0.000 0.118 17	South Dakota	0.333	0.000	0.000	0.000	0.167	12
Utah 0.167 0.147 0.059 0.069 0.088 100 Virginia 0.183 0.152 0.101 0.148 0.125 256 Vermont 0.467 0.067 0.067 0.067 0.067 15 Washington 0.139 0.145 0.164 0.115 0.194 165 Wisconsin 0.234 0.207 0.135 0.063 0.216 110 West Virginia 0.059 0.471 0.059 0.000 0.118 17		0.209			0.096		115
Utah 0.167 0.147 0.059 0.069 0.088 100 Virginia 0.183 0.152 0.101 0.148 0.125 256 Vermont 0.467 0.067 0.067 0.067 0.067 15 Washington 0.139 0.145 0.164 0.115 0.194 165 Wisconsin 0.234 0.207 0.135 0.063 0.216 110 West Virginia 0.059 0.471 0.059 0.000 0.118 17	Texas	0.164	0.179	0.118	0.148	0.151	865
Virginia 0.183 0.152 0.101 0.148 0.125 256 Vermont 0.467 0.067 0.067 0.067 0.067 15 Washington 0.139 0.145 0.164 0.115 0.194 165 Wisconsin 0.234 0.207 0.135 0.063 0.216 110 West Virginia 0.059 0.471 0.059 0.000 0.118 17							
Vermont 0.467 0.067 0.067 0.067 0.067 15 Washington 0.139 0.145 0.164 0.115 0.194 165 Wisconsin 0.234 0.207 0.135 0.063 0.216 110 West Virginia 0.059 0.471 0.059 0.000 0.118 17							
Washington 0.139 0.145 0.164 0.115 0.194 165 Wisconsin 0.234 0.207 0.135 0.063 0.216 110 West Virginia 0.059 0.471 0.059 0.000 0.118 17							
Wisconsin 0.234 0.207 0.135 0.063 0.216 110 West Virginia 0.059 0.471 0.059 0.000 0.118 17							
West Virginia $0.059 0.471 0.059 0.000 0.118 17$	-						