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| | | Б | 1.0.1 | | |
| C | an Government | Dema | and Stimula | te Privat | e |
| | I | nvestn | nent? | | |
| | Evidence from | m U.S. Fe | deral Procureme | nt | |

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Jan 4, 2019 AEA, Atlanta

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INTRODUCTION

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| Backgrou | nd | | | | |

- Fiscal policy affects the economy through several channels, most prominently via its effects on private consumption and investment
- A number of studies examine the response of private consumption to fiscal stimuli
- Less attention has been paid to the reaction of private investment to government demand at the firm level

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- A central issue in several contexts
- Today: We look at firm capital investment

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| This Pape | er | | | | |

- asks: How much of federal government spending in the US translates into private capital investment?
- uses firm-level data linking federal awards with financial information
- finds that

financially constrained firms increase their capital investment by 10-13 cent for every dollar of government purchases

- 2 the increase in investment is mostly financed via short-term borrowing, and
- **3** effects transmit to the industry level

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LITERATURE & HYPOTHESIS

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| Related | l Literature | | | | |

- Effects of fiscal policy on firms' investment with micro data: Zwick and Mahon (2017), Dobridge (2015), Ferraz et al (2015)
- Regional or industry-level effects of fiscal policy:
 - → distinct but somewhat related to the idea of estimating a local fiscal multiplier: Auerbach, Gorodnichenko, and Murphy (2019)
 - \rightarrow Brueckner and Tuladhar (2014), Aghion et al (2014), Boehm (2018)
- Fiscal policy and financial intermediation in macro models: Fernandez-Villaverde (2010), Challe and Ragot (2011), Canzoneri et al. (2015)

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| Hypoth | esis Developn | nent | | | |

Financial Accelerator Model

- Firm produces with a number of inputs, one of them is capital
- If the collateral-in-advance constraint is binding, there exists a financing premium (Bernanke, Gertler, and Gilchrist, 1996)
- The creation of new demand by the government increases the net wealth of the firm through the additionally generated cash flow, which:
 - $\rightarrow~{\rm reduces}$ the external financing premium
 - \rightarrow relaxes the constraint
 - \rightarrow and hence increases firms' demand for inputs

We expect: A positive government demand shock increases capital investment particularly by financially constrained firms

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Data

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| | | | | | |
| Data | | | | | |
| Procurement | Contracts | | | | |

- Federal Funding Accountability and Transparency Act made available all federal procurement contracts
 - Names of entities receiving awards
 - Amount of awards
 - Signing dates
 - Characteristics such as
 - Funding agency
 - Number of bidders
- In principle, data are available from 1997 onwards
- Focus on unanticipated contracts: Full and open competition only with at least two bidders
- Scale by firm's capital (property, plants and equipment, PPE) following the literature (e.g., Chaney et al., 2012)

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Merging with Firm-Level Data

- Match with Compustat Quarterly
- Baseline sample
 - All firms that were awarded at least one contract between 1999Q3 and 2017Q3
 - Quarterly dataset of \approx 1,200 firms (in total: 62,816 observations)
- Subsamples:
 - Small (lowest vs highest tercile)
 - Low dividend payout ratio (lowest vs highest tercile)
 - Have a low or no credit rating
- Interpret those as more likely to be financially constrained (Almeida and Campello, 2007; among others)





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Distribution of Spending



(a) Histogram of Awarded Contracts

| Agriculture, | Forestry & Fishing | | | |
|--------------|---------------------|---|---|--|
| Mining | | | | |
| Communitie | n | | | |
| Guppet Ma | ARESSIGN VIE APR | es. | | |
| Other Maria | Akting | | | |
| Tumportal | ion & Communication | 6. The second | | |
| Whitehale | Trade | | | |
| Retail Trade | | | | |
| Finance & I | hsunance | | | |
| Services | | and the second second | | |
| Noclassife | able | | | |
| 0 | .1 | 2 | 3 | |
| | | Share of Spendin | g | |

(b) Industry Distribution

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IDENTIFICATION

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| Panel F | E Model | | | | |

• Specification: Use the model of Chaney et al. (2012; AER):

$$\frac{I_{it}}{K_{i,t-1}} = \alpha_0 + \beta \frac{\text{Award}_{it}}{K_{i,t-1}} + \alpha_i + \delta_{t,s} + \gamma' X_{it} + u_{it}$$

- Controls include firm size, Return on Assets, Market-to-book and cash Summary stats
- Estimate for subsamples of constrained and unconstrained firms; equivalent to a fully interacted regression model

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• Standard errors clustered at the firm level

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Propensity Score Matching (PSM)

- Concern about FE model: Firms that win a federal contract can be inherently different
- Use PSM to address this concern. To estimate causal effects using PSM:
 - Estimate the propensity of winning a federal contract (treatment) for both treated and control firms
 - Match treatment and control observations with similar values of propensity score
 - match within industry-period
 - match a treated firm to the nearest firm in the control group
 - Estimate the effect of federal contracts on investment (treatment effect) using the PSM control group

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▶ Figure

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RESULTS

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| Introduction | Literature & Hypothesis | Data | Identification | Results | Conclusion |
|--------------|-------------------------|----------|----------------|---------|------------|
| Financia | al Constraints: | Regressi | on Results | | |
| .4 | Small Firms : | 1 | | - | |
| 6 | Large Firms : | | | | |
| | Payout Low : | | | - | |
| F | Payout High : | - | | - | |
| | Low Rating : | | | - | |
| | | | | | |

High Rating : -.1 0 .1 .2 Capital Investment per Dollar of Awarded Contract



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PSM Results



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Robustness and Additional Results

- Inverse Probability Weighting Estimation
 Table
- DoD contracts
 Table
- Dynamic (Blundell-Bond) panel model Table
- Contracts appear unanticipated by stock markets (and trading on contracts is profitable)

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| Introduction | Literature & Hypothesis | Data | Identification | Results | Conclusion |
|--------------|-------------------------|------|----------------|---------|------------|
| Financin | ıg | | | | |

- If mostly constrained firms, we would expect to find an effect on debt (especially short-term) financing
- Test using

$$\frac{\Delta y_{it}}{y_{i,t-1}} = \alpha_0 + \beta \frac{\operatorname{Award}_{it}}{K_{i,t-1}} + \alpha_i + \delta_{t,s} + \gamma' X_{it} + u_{it},$$

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• where *y*_{*it*} is short-term liabilities



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| Industry- | level Analysi | S | | | |

- Industry-wide effect? Ultimately, it is an empirical question. It could go either way:
 - Positive spillovers to investment of other firms,
 - e.g., via supplier network
 - 2 Crowds-out other firms' investment,
 - e.g., via higher input prices or scarce capital
- Idea to test: Aggregate investment for ALL Compustat firms in same industry (4 digit SIC) in a quarter. Regress on aggregated contract sum.

| Introduction | Literature & Hypothesis | Data | Identification | Results | Conclusion |
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Industry-level Investment



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CONCLUSION

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| Summary | 7 | | | | |

- We find that 1\$ of federal spending increases firms' capital investment by 12 cents
- In line with the financial accelerator model, effects are significant for financially constrained firms

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- Capital investment is mainly financed via short-term debt
- The increase in investment transmits to the industry level

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Appendix

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Summary Statistics

| Variable | Mean | Median | Std | p25 | p75 |
|--|------------|---------|-------------|-----------|-----------|
| Contract amount (quarter) | 28,400,000 | 369,000 | 161,000,000 | 57130.000 | 2,910,000 |
| $\frac{Award_{i,t}}{K_{i,t-1}}$ | 0.077 | 0.002 | 0.241 | 0.000 | 0.016 |
| Capital investment $\left(\frac{I_{it}}{K_{i+1}}\right)$ | 0.069 | 0.045 | 0.080 | 0.026 | 0.080 |
| RoA | 1.624 | 2.022 | 3.717 | 0.828 | 3.310 |
| Market to book | 1.943 | 1.507 | 1.333 | 1.166 | 2.182 |
| Cash | 0.102 | 0.105 | 0.680 | 0.034 | 0.250 |
| Rating | 11.326 | 12.000 | 3.289 | 9.000 | 14.000 |
| Size | 6.894 | 6.927 | 2.089 | 5.484 | 8.317 |
| Payout ratio | 0.806 | 0.028 | 2.492 | 0.000 | 0.501 |

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Distribution of Predicted Probabilities (PSM)



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| Baseline | e Results | | | | |

Table: The Effect of Government Contracts on Firm Investment

| | (1) | (2) | (3) | (4) | (5) |
|-------------------------------|----------|----------|----------|----------|-------------------|
| Awarded Contract _t | 0.143*** | 0.121*** | 0.151*** | 0.119*** | 0.100*** |
| Ceel | (0.027) | (0.034) | (0.027) | (0.035) | (0.033) |
| Cash | | | | | (0.020°) |
| Mkt to $Book_{t-1}$ | | | | | 0.077*** |
| | | | | | (0.006) |
| RoA_{t-1} | | | | | 0.011*** |
| | | | | | (0.002) |
| $Size_{t-1}$ | | | | | 0.013 |
| _ | | | | | (0.010) |
| Constant | 0.290*** | 0.291*** | 0.290*** | 0.225*** | -0.032 |
| | (0.005) | (0.001) | (0.005) | (0.016) | (0.077) |
| Firm FE | No | Yes | No | Yes | Yes |
| Industry-Time | No | No | Yes | Yes | Yes |
| R2 | 0.005 | 0.002 | 0.029 | 0.056 | 0.131 |
| Ν | 62816 | 62816 | 62816 | 62816 | 59140 |

Financial Constraints

| | Firm size | | Pay | outs | Credit rating | |
|-------------------------------|-----------|----------|----------|----------|---------------|----------|
| | Small | Large | Low | High | Low | High |
| Awarded Contract _t | 0.116*** | -0.051 | 0.107** | 0.080 | 0.116*** | 0.006 |
| | (0.044) | (0.035) | (0.044) | (0.052) | (0.034) | (0.037) |
| Casht | 0.002 | 0.208*** | -0.004 | 0.153*** | 0.018 | 0.065** |
| | (0.012) | (0.049) | (0.011) | (0.023) | (0.011) | (0.026) |
| Mkt to $Book_{t-1}$ | 0.074*** | 0.062*** | 0.085*** | 0.037*** | 0.080*** | 0.040*** |
| | (0.008) | (0.011) | (0.007) | (0.007) | (0.006) | (0.006) |
| RoA_{t-1} | 0.017*** | 0.002 | 0.015*** | 0.001 | 0.012*** | 0.005*** |
| | (0.002) | (0.002) | (0.002) | (0.002) | (0.002) | (0.002) |
| $Size_{t-1}$ | 0.024 | 0.011 | 0.036*** | -0.017 | 0.010 | 0.055*** |
| | (0.018) | (0.013) | (0.014) | (0.012) | (0.011) | (0.019) |
| Constant | -0.031 | -0.075 | -0.191* | 0.257** | -0.001 | -0.476** |
| | (0.107) | (0.130) | (0.099) | (0.104) | (0.081) | (0.195) |
| Firm FE | Yes | Yes | Yes | Yes | Yes | Yes |
| Industry-Time FE | Yes | Yes | Yes | Yes | Yes | Yes |
| R2 | 0.138 | 0.228 | 0.160 | 0.144 | 0.133 | 0.376 |
| Ν | 18818 | 20395 | 27427 | 19883 | 49878 | 6209 |

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| Restrict | ed Sam | ple: Do | oD Cont | tracts | | |
| | Small Firms : | | | | | |
| | Large Firms : | - | • | | | |
| | Payout Low : | | | - | - | |
| | Payout High : | | - | | - | |
| | Low Rating : | | | | _ | |
| | High Rating : | | _ | 1 | - | |
| | | 2 | 1 | 0 | .1 .2 | |

Capital Investment per Dollar of Awarded Contract

Dynamic Arellano-Blundell-Bond Model

| | Firm size | | Payo | outs | Credit rating | |
|-------------------------------|-----------|-----------|-----------|----------|---------------|----------|
| | Small | Large | Low | High | Low | High |
| Investment _{t-1} | 0.907*** | 0.773*** | 0.869*** | 0.841*** | 0.889*** | 0.891*** |
| | (0.011) | (0.029) | (0.015) | (0.019) | (0.009) | (0.027) |
| Awarded Contract _t | 0.049*** | 0.011 | 0.028* | 0.010 | 0.036*** | -0.008 |
| | (0.016) | (0.012) | (0.016) | (0.012) | (0.014) | (0.010) |
| Cash _t | 0.008** | 0.087*** | 0.013*** | 0.022** | 0.017*** | 0.009 |
| | (0.004) | (0.021) | (0.004) | (0.009) | (0.004) | (0.016) |
| Mkt to Book $_{t-1}$ | 0.012*** | 0.021*** | 0.014*** | -0.008 | 0.010*** | 0.006** |
| | (0.004) | (0.006) | (0.004) | (0.005) | (0.003) | (0.003) |
| RoA_{t-1} | 0.007*** | 0.001 | 0.008*** | 0.001 | 0.007*** | -0.001 |
| | (0.001) | (0.001) | (0.001) | (0.001) | (0.001) | (0.001) |
| $Size_{t-1}$ | -0.067*** | -0.027*** | -0.091*** | -0.022** | -0.066*** | -0.020** |
| | (0.011) | (0.007) | (0.011) | (0.008) | (0.009) | (0.008) |
| Constant | 0.375*** | 0.229*** | 0.559*** | 0.185*** | 0.470*** | 0.204** |
| | (0.078) | (0.065) | (0.086) | (0.068) | (0.071) | (0.080) |
| Firm FE | Yes | Yes | Yes | Yes | Yes | Yes |
| Time FE | Yes | Yes | Yes | Yes | Yes | Yes |
| R2 | | | | | | |
| Ν | 18650 | 20331 | 27147 | 19834 | 49537 | 6198 |