

Regulatory Risk Perception and Small Business Lending

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Government Lending Support to Small Businesses

Worldwide, governments provide credit support to small businesses...

- Direct lending or credit guarantees
- Large literature on outcomes of these schemes



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... but little is known about role of public employees allocating capital!

- Impersonal rule-based bureaucracy; **OR...**
- **economic agents** with pecuniary incentives and **personal experiences**



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We focus on the U.S. Small Business Administration (SBA)

- Flagship credit guarantee program; recently: PPP loans

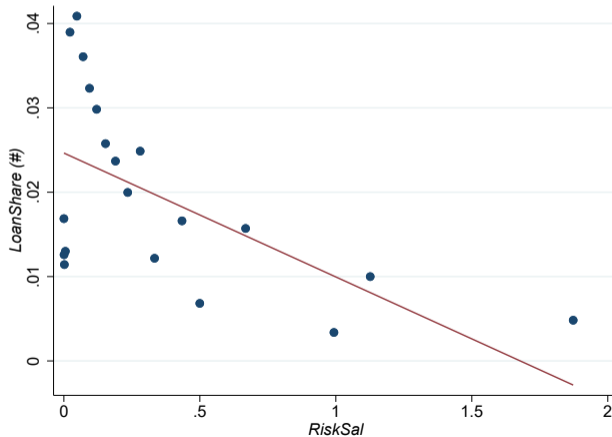


The Paper in a nutshell

- The SBA is exposed to **default risk**
 - It must purchase defaulted loans from private lenders
- We focus on **risk salience**
 - How prominent is the default risk, in the eyes of SBA employees
- Core prediction: **risk salience reduces SBA lending**
 - Mechanism: **risk salience** increases **risk perception**
 - SBA guarantees reallocated to businesses with lower perceived risk
- Utilize a novel **employee-level data set:**
 - A panel of 18,740 SBA employees over 25 years
 - Bottom-up measure of risk salience, based on **personal experiences**: defaults in past & present workplaces



Key Result: Risk salience reduces lending and job creation



Results:

- Reduction in new originations
- Leads to decline in jobs and small firm creation

Empirical Strategy:

- Instrument risk salience with defaults in distant locations

Mechanisms:

- Bank participation, demand stimulation, screening

Background & hypotheses



SBA's strategic goal: support small business growth

- The SBA's main activities include:
 - **Access to finance**: 7(a), 504, Microloan programs
 - Support **innovation** and **exporting** activities of small businesses
- We focus on **7(a) loan guarantees**
 - The SBA's **flagship loan guarantee program**
 - Targets businesses who cannot obtain credit elsewhere
 - Loans are made and administered by private banks
 - The SBA guarantees $\leq 90\%$ of each loan
 - If a loan defaults, the SBA purchases it up to the guarantee rate



SBA jurisdictions & local offices



Local office's tasks:

- **Lender participation:** recruit & supervise banks
- **Loan demand:** outreach to local business owners
- **Screening** of guarantee applications (legacy)



Salient events increase risk perception

People rely on **salient experiences** to assess probability, even though the **actual probability** did not change (Tversky & Kahneman, 1973; Kahneman & Tversky, 2013; Bordalo et al., 2013)

H_1 : Risk salience \uparrow \Rightarrow risk perception \uparrow \Rightarrow SBA lending \downarrow

- Defaults on SBA loans (**salience**) increase perceived default risk (**perception**)
- This triggers concerns of **budget constraints** and **reputational** implications
- Consequently, SBA redirects efforts toward less-risky businesses

H_0 : Risk salience \nRightarrow risk perception \nRightarrow SBA lending

Data & measurement



Loan-level data (publicly available)



Lender's Application for Loan Guaranty
For all 7(a) Loan Programs

OMB Control No.: 3245-0348
Expiration Date: 07/31/2020

A. Processing Method		Processing Options (if applicable)	
<input type="checkbox"/> 7(a) Non-Delegated Processing <input type="checkbox"/> 7(a) Delegated Processing	<input type="checkbox"/> 7(a) Small Loan (\$350,000 or less with an acceptable credit score)		
	CAPLINE Program <input type="checkbox"/> Working Capital <input type="checkbox"/> Seasonal <input type="checkbox"/> Builders <input type="checkbox"/> Contract <input type="checkbox"/> SBA Express <input type="checkbox"/> Revolving <input type="checkbox"/> Term Loan <input type="checkbox"/> Export Express <input type="checkbox"/> Revolving <input type="checkbox"/> Term Loan		
		<input type="checkbox"/> International Trade Loan	
		<input type="checkbox"/> Export Working Capital Program (EWCP) Loan	
		<input type="checkbox"/> Community Advantage (CA) Pilot Program (\$250,000 or less with an acceptable credit score)	
		<input type="checkbox"/> Other (Explain): _____	

B. Applicant Business Information	
Applicant Business	<input type="checkbox"/> Startup Business (Not opened yet) <input type="checkbox"/> Existing Business (more than 2 years old) Date Business Established: _____
	<input type="checkbox"/> New Business (2 years or less) <input type="checkbox"/> Change of Ownership Date Current Ownership Established: _____
	Applicant Business Legal Name: _____ <input type="checkbox"/> Check if EPC NAICS Code: _____
	DBA: _____ Business Tax ID: _____
	Applicant Address: _____ City, ST, Zip: _____
Other	Business Location: <input type="checkbox"/> Rural <input type="checkbox"/> Urban Legal Structure: <input type="checkbox"/> Sole Proprietor <input type="checkbox"/> Partnership <input type="checkbox"/> Corp <input type="checkbox"/> LLC <input type="checkbox"/> Other
	Applicant Primary Contact: _____ Primary Contact Phone: () - _____
	# of employees prior to this loan: _____ # of jobs created because of this loan: _____ # of jobs retained because of this loan: _____
	<input type="checkbox"/> OC / <input type="checkbox"/> Co-Applicant: _____ Sole Proprietor <input type="checkbox"/> Partnership <input type="checkbox"/> Corp <input type="checkbox"/> LLC <input type="checkbox"/> Other
Co-Applicant Address: _____ Business Tax ID: _____	
City, ST, Zip: _____ Date Established: _____	

**Use a separate sheet if more than two Applicants*

C. Lender Information	
Lender Name: _____	Lender ID: _____
Address: _____	City: _____ ST: _____ Zip: _____
Lender Contact: _____	Ph: () - _____ Cell or Ext: () - _____
Contact Email: _____	Title: _____
Alternate Contact Information <input type="checkbox"/> Check if this contact will be the primary contact for loan processing information	
Alternate Name (if other than Lender): _____	Contact Type: <input type="checkbox"/> Lender Employee <input type="checkbox"/> LSP
Alternate Contact: _____	Ph: () - _____ Cell or Ext: () - _____
Alternate Contact Email: _____	Title: _____

- Sample includes 1,395,888 loan guarantees, 1996-2019
 - Info on borrower & lender
 - Loan date, amount, guarantee rate
 - Ex-post performance (charge-offs)
- **Aggregated to office × industry**
 - SBA office in charge
 - The borrower's (3-digit NAICS) industry



Workforce data (new!)

- **All SBA employees, 1996-2020**
- 18,740 unique employees and 96,535 employee-year observations
- Includes names, salaries, tenure, bonuses, location, etc.
- Based on repeated **FOIA requests**:
 - **First paper** to tap the SBA's selection-free HR data
- **Matched to loan-level data based on office location**



Main measure: risk salience

- We define risk salience based on SBA loan defaults in a particular industry
- Office×industry risk salience
 - Average of employee×industry risk salience
- Employee×industry risk salience
 - Based on current defaults in present and past workplaces
 - Employees likely keep track of developments in former locations
 - Motivated by recent research on social networks (e.g., Bailey et al., 2018)
- Challenge: Local industry conditions driving both risk salience & SBA lending
- Approach: Use only distant defaults

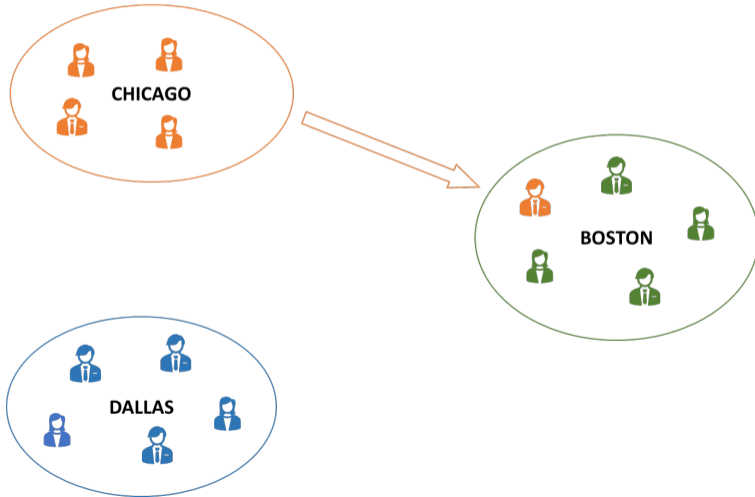


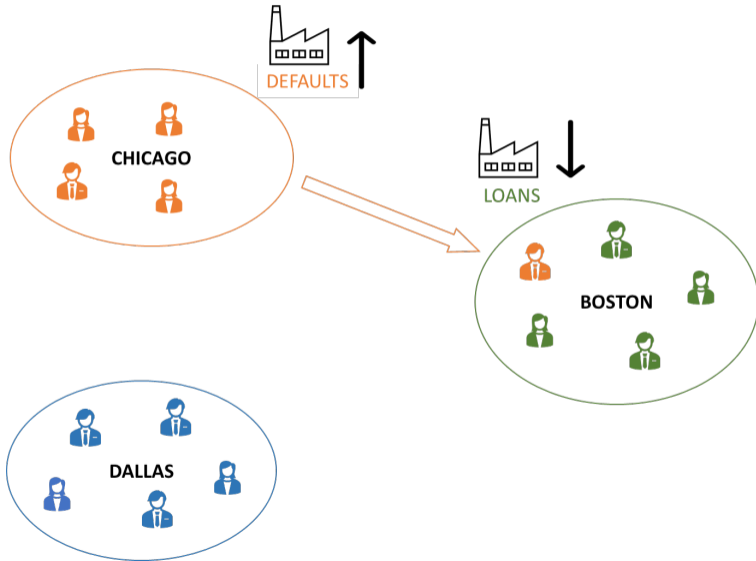
Visual Illustration of IV Empirical Strategy

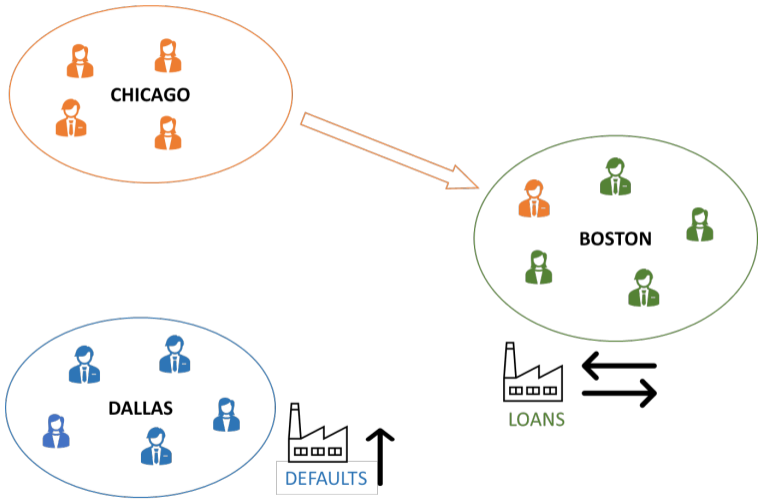




Visual Illustration of IV Empirical Strategy







Main results



Baseline specification

$$y_{o,i,t+l} = \alpha + \beta \cdot RiskSal_{o,i,t} + \vec{X}_{o,i} + \epsilon$$

- $y_{o,i,t+l}$ = **loan guarantees** by office o to industry i
 - Probability of any loan guarantee
 - Industry i 's share within office o 's loan portfolio
- $RiskSal_{o,i,t}$ = **salience** of industry i 's risk, in the eyes of office o
 - Weighted average of industry i 's defaults across selected regions
- $\vec{X}_{o,i}$ = Controls + Fixed Effects
 - Control for office \times industry **#workers** (\approx **demand**)
 - Office \times industry FE (deviation from **long-run trend** in lending relations)
 - Additional FE (next slide)



Main result: (Instrumented) Risk Salience reduces Lending

Outcome:	<i>LoanShare</i>			
$\widehat{RiskSal}$	-0.396*** (0.033)	-0.441*** (0.030)	-0.383*** (0.023)	-0.346*** (0.018)
Obs.	50,598	50,598	46,837	46,778
F–statistic	622	697	712	684
Effect	-0.169	-0.188	-0.167	-0.151
Effect (%)	-10.8	-12.0	-11.4	-10.3
Controls	Y	Y	Y	Y
Office×NAICS3 FE	Y	Y	Y	Y
Year FE	Y	-	-	-
Year×Office FE	-	Y	-	-
Year×Office×NAICS2 FE	-	-	Y	Y
Year×NAICS3 FE	-	-	-	Y



Main results: Real Effects and Portfolio Riskiness

- Main result: salient risk reduces SBA lending
 - Larger effect in smaller offices
- This contraction of lending has **real effects**
 - Decline in jobs being created with SBA loans
 - Decline in creation of new firms with 1-4 employees
- The new loans are ex-post **safer**
 - Loans originated when risk salience is high are less likely to default
 - Our interpretation: **risk salience** increases **risk perception**

Mechanisms



Overview

- **Main result:** salient risk reduces SBA lending
- **In this section:**
 - **Why** does risk salience affect risk perception?
 - **Rational learning** versus **Mechanic belief updating**
 - No evidence that distant defaults are informative.
 - **How** does risk perception affect SBA lending?
 - How risk perception changes **specific SBA activities**
 - Lender participation, borrower awareness, screening



How does the SBA reduce lending for “risky” industry?

Local SBA offices do not issue loans, but have indirect influence on bank decisions:

- **Loan supply:** recruiting, training, & supervising participating lenders
- **Loan demand:** education & outreach to local business owners
- **Screening:** review eligibility of guarantee applications



(1) Lender participation

- Local offices affect **lender participation**
 - **Determines eligibility** to become a 7(a) participant
 - **Training** approved lenders on SBA's policies and procedures
 - **Reviewing** lender performance (e.g., how it processes and liquidates SBA loans)
- Risk salience could **discourage lender participation**
- We find that risk salience -
 - **Reduces the number of new entrants**, who struggle to get training or approval
 - **Reduces the number of lenders**, some of whom are not re-approved
 - **Increases market concentration** (HHI) among the remaining lenders



(2) Outreach & education

- Local offices affect **demand by small businesses**
 - **Outreach and education** activities
 - Informing potential borrowers about SBA-backed financing opportunities
- Risk salience could **discourage borrowing**
- We find that risk salience -
 - **Reduces the number of new borrowers**, who respond to outreach campaigns
 - **Reduces the number of borrowers**
 - **Increases market concentration** among the remaining borrowers



(3) Screening: Evidence from loan centralization

- Loan processing activities were **centralized** during 2003-2007
- Post-centralization, local offices **rarely involved in credit determination**
- That yields a natural prediction: Risk salience matters more when local offices screen guarantee applications
- We find a **significant drop in the magnitude** after 2007 (50%)



Conclusions

- **When defaults become more salient, SBA lending is lower**
 - Salient defaults increase the perception of risk
 - Higher risk perception reduces **quantity** of loan guarantees
 - Consistent with **mechanic belief updating** (as opposed to rational)
 - Mechanisms: **bank participation, loan demand, screening**
- **Takeaway:**

Internal government frictions spill over to the economy

Thank You

Appendix



Why do SBA employees move?

Outcome:	<i>Out_t</i>			
<i>Promotion_t</i>	0.044*** (0.005)	0.041*** (0.005)	0.040*** (0.005)	0.039*** (0.005)
<i>HighSalary_{t-1}</i>	0.015*** (0.002)	0.013*** (0.002)	0.020*** (0.004)	0.018*** (0.003)
<i>LongTenure_{t-1}</i>	-0.014*** (0.002)	-0.014*** (0.002)	0.004 (0.003)	0.003 (0.002)
Δ <i>Salary_{t-1}</i>	0.008 (0.020)	0.006 (0.020)	-0.002 (0.013)	0.001 (0.015)
<i>PastTransfer_{t-1}</i>	0.030*** (0.004)	0.030*** (0.004)	-0.267*** (0.019)	-0.262*** (0.019)
Obs.	61,714	61,671	59,932	59,885
R^2	0.029	0.083	0.286	0.324
Year FE	Y	-	Y	-
Office FE	Y	-	Y	-
Year \times Office FE	-	Y	-	Y
Employee FE	-	-	Y	Y



Effects on Business Formation

Outcome:	<i>New</i> ¹⁻⁴			
<i>RiskSal</i>	-14.2*** (4.2)	-12.0*** (3.4)	-11.1*** (3.4)	-2.7** (1.1)
Obs.	50,598	50,598	46,837	46,778
<i>F</i> -statistic	622	697	712	684
Effect	-6.1	-5.1	-4.8	-1.2
Effect (%)	-67.7	-57.3	-74.2	-18.4
Controls	Y	Y	Y	Y
Office×NAICS3 FE	Y	Y	Y	Y
Year FE	Y	-	-	-
Year×Office FE	-	Y	-	-
Year×Office×NAICS2 FE	-	-	Y	Y
Year×NAICS3 FE	-	-	-	Y



Ex-post default rates are lower

Outcome:	<i>DefRate</i> #		
$\widehat{RiskSal}$	-3.224*** (0.840)	-2.901*** (0.768)	-2.314*** (0.798)
Obs.	40,948	36,593	36,463
<i>F</i> -statistic	587	613	582
Effect	-1.3	-1.2	-1.0
Effect (%)	-7.4	-6.7	-5.3
Controls	Y	Y	Y
Office×NAICS3 FE	Y	Y	Y
Year×Office FE	Y	-	-
Year×Office×NAICS2 FE	-	Y	Y
Year×NAICS3 FE	-	-	Y



Lender Participation - Findings

Outcome:	<i>Lenders</i>	<i>Lend^{new}</i>	<i>Lend^{HHI},#</i>	<i>Lend^{HHI},\$</i>
$\widehat{RiskSal}$	-1.515*** (0.152)	-0.583*** (0.056)	13.103*** (1.107)	12.616*** (0.908)
Obs.	48,906	48,906	48,906	48,906
<i>F</i> -statistic	719	719	719	719
Effect	-0.611	-0.235	5.287	5.091
Effect (%)	-9.7	-11.7	11.9	9.5
Controls	Y	Y	Y	Y
Office×NAICS3 FE	Y	Y	Y	Y
Year×Office FE	Y	Y	Y	Y



Outreach & Education - Findings

Outcome:	<i>Borrowers</i>	<i>Borr^{new}</i>	<i>Borr^{HHI,#}</i>	<i>Borr^{HHI,\$}</i>
$\widehat{RiskSal}$	-4.330*** (0.683)	-4.125*** (0.660)	15.887*** (1.213)	14.338*** (1.018)
Obs.	48,906	48,906	48,906	48,906
F-statistic	719	719	719	719
Effect	-1.747	-1.664	6.410	5.785
Effect (%)	-12.6	-13.0	17.7	12.1
Controls	Y	Y	Y	Y
Office×NAICS3 FE	Y	Y	Y	Y
Year×Office FE	Y	Y	Y	Y



Screening - Findings

Outcome:	Loans							
	(98-03)	(08-19)	(98-03)	(08-19)	(98-03)	(08-19)	(98-03)	(08-19)
$\widehat{RiskSal}$	-0.61*** (0.06)	-0.34*** (0.01)	-0.63*** (0.07)	-0.38*** (0.01)	-0.52*** (0.07)	-0.34*** (0.01)	-0.48*** (0.06)	-0.33*** (0.01)
Obs.	8,144	31,073	8,144	31,073	7,071	28,952	7,007	28,926
Δ (in %)		0.45		0.41		0.34		0.31
p -val		0.00		0.00		0.00		0.00
Controls	Y	Y	Y	Y	Y	Y	Y	Y
Office×NAICS3 FE	Y	Y	Y	Y	Y	Y	Y	Y
Year FE	Y	-	-	-	Y	-	-	-
Year×Office FE	-	Y	-	-	-	Y	-	-
Year×Office×NAICS2 FE	-	-	Y	Y	-	-	Y	Y
Year×NAICS3 FE	-	-	-	Y	-	-	-	Y