Quantifying Firm Runs

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Research question

How relevant are firm runs, and what are their macroeconomic and policy implications?

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 Cole Kehoe 2000; Bocola Dovis 2020
- Identify incidence of runs exploiting heterogeneity in firm's bankruptcy outcomes (liquidiation vs restructuring) insights from Corp Law literature, e.g., Jackson 1986; Corbae D'Erasmo 2021
- Conduct quantitative analysis of U.S. economy to asses aggregate relevance of firm runs

related papers on runs

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- + 1.5% firms rollover prob = 20% exposed × 7% probability (more than 60% of bankruptcy events are driven by runs)
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- 3. What are the **policy** implications?
 - + credit policy can undo runs amplification of crises, but can backfire
 - imperfect credit policy precludes runs, but exacerbate future debt overhang

Outline

- Theoretical Framework
- Identifying Firm Runs
- Macroeconomic Consequences of Firm Runs

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Overview of the Model

- Quantitative GE models of heterogeneous firms with default Khan Senga Thomas 2017; Ottonello Winberry 2020
- Extend model to
 - 1. possibility of coordination failures among creditors á la Cole Kehoe 2000
 - 2. allow debt restructuring similar to Corbae D'Erasmo 2021
- Study unforseen crises and policy shocks (MIT shocks)

Environment

• Infinite horizon and discrete time

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- Four types of agents
 - 1. nonfinancial firms: invest and produce to maximize their value
 - 2. creditors: lend to nonfinancial firms, and are perfectly competitive and atomistic
 - 3. capital producer: sell capital to nonfinancial firms
 - 4. representative HH: consumes, saves and works. Owns all firms in the economy

Nonfinancial Firms' Environment

• Firm i objective is to max

$$\sum_{t\geq 0} \mathbb{E}_0[\Lambda_t d_{\text{it}}]$$

with Λ_t HH's SDF and d_t firm's dividends

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- Idiosyncratic state variables:
 - 1. s_{it}^f exogenous
 - 2. s_{it}^{nf} exogenous non-fundamental
 - 3. s_{it}^e endogenous

where
$$s_{it} = (s_{it}^f, s_{it}^{nf}, s_{it}^e)$$

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• For clarity, drop i and t subscripts

Within period firms' (with no exit shock) timing is as follows

1. All uncertainty about fundamentals and nonfundamentals is realized

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- 2. **Restructure** choice
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- 4. **Liquidation** choice (if continue in 2)
- 5. Firms produce and distribute dividends (if don't liquidated in 4)

Nonfinancial Firms' Production

Operate with technology

$$f(z, \omega, k, l) = z(\omega k)^{\alpha} l^{\nu}$$

- decreasing returns to scale $\nu + \alpha < 1$
- ▶ idiosyncratic persisent productivity shocks $\ln z' = \rho_z \ln z + \epsilon_z$ with $\epsilon_z \sim N(0, \sigma_z^2)$
- ▶ idiosyncratic capital quality shock ω iid log-normal trunc. where $\ln \omega \in [\underline{\omega}, 0]$ (fit quantitative default rate)

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- Own capital k and hire labor l at wage w, then operating profits are

$$\pi(z, \omega, k) = \max_{l} f(z, \omega, k, l) - wl$$

Nonfinancial Firms' Financial Resources

- Internal resources (cash-on-hand)
 - inherits k at price q which depreciates at $\delta \in [0,1]$ and maturing b, and has $\pi(z,\omega,k)$

$$n = \underbrace{\pi(z, \omega, k)}_{\text{operational profits}} + \underbrace{(1 - \delta)q\omega k}_{\text{selling value of capital}} - \underbrace{b}_{\text{maturing debt}}$$

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 - issues one-period debt b^\prime at price schedule Q(.) and buys k^\prime at price q

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- (net) External resources
 - issues one-period debt b' at price schedule Q(.) and buys k' at price q
- Dividends
 - distributed at end of period

$$d = n + Q(.)b' - qk'$$

cash-on-hand new debt issuance resources capital purchases

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1. No-equity issuance constraint $d \ge 0$ (data low eq issuance, standard and simplify)

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 - (a) liquidation (Chapter 7)
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 - ▶ firm exits with V = 0 and creditors of b recover $\alpha_7 \in [0, 1]$ of the liquidated capital

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 - (a) liquidation (Chapter 7)
 - non selective default on b and b'
 - ▶ firm exits with V = 0 and creditors of b recover $\alpha_7 \in [0, 1]$ of the liquidated capital
 - (b) restructuring (Chapter 11)
 - Nash) bargain debt recovery rate $\alpha_{11} \in (0,1)$ over debt b detail
 - ▶ firm pays exogenous cost $c_{11} \in [0,1]$, which is proportional to capital
 - precludes current firm runs (bankruptcy provisions, Corp Law)
 - resources after restructuring are: $n_{11} = \pi(z, \omega, k) + (1 c_{11})(1 \delta)q\omega k \alpha_{11}b$

US bankruptcy code

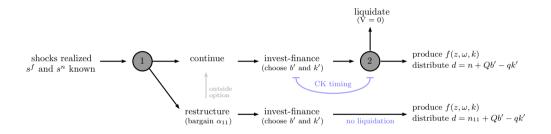
Nonfinancial Firms' Entry/Exit

Technical and quantitative assumptions

- Exogenous exit probability γ (KST 2016, stationary dist)
 - ▶ if receive shock the firm exits after production
- Entrants enter on average productivity m% below ergodic distribution average (OW 2020, life-cycle firms)

details

Within Period Timing Nonfinancial Firms' Problem



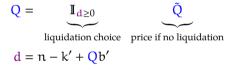
- Timing for non-exiting firms
- Cole Kehoe 2000 (CK) timing for liquidation choice

Multiple Equilibrium Intuition

• Liquidate if they can't satisfy $d \ge 0$ (result of assumptions)

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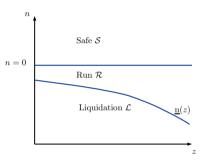
$$Q = \underbrace{\mathbb{I}_{d \ge 0}}_{\text{liquidation choice}} \underbrace{\tilde{Q}}_{\text{price if no liquidation}}$$
$$d = n - k' + Qb'$$

Feedback between liquidation choice and prices today could create multiple outcomes

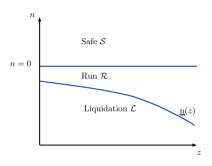
$$\begin{aligned} Q &= 0 &\iff d < 0 \\ Q &> 0 &\iff d \geq 0 \end{aligned}$$

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• Fundamental state-space (z, n) is divided in three regions liquidation proposition

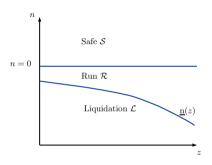


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$$\mathcal{S}$$
: $Q = 0$ then continue if $d = n + \underbrace{\max_{k'} \{-k'\}}_{0} > 0$

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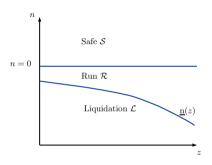


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$$\mathcal{L}:Q=\tilde{Q}$$
 then liquidate if $d=n+\underbrace{\underset{k',b'}{max}\{-k'+\tilde{Q}\,b'\}}_{-\underline{n}(z)}<0$

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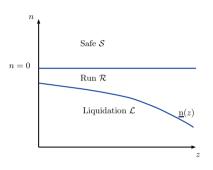


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$$\, {\mathcal R}$$
 : liquidate if $\, Q = 0$, continue if $\, Q = \tilde{Q} \, > 0 \,$

• Define idiosyncratic sunspot shock $\phi \sim^{iid} U[0,1]$ draw every period, such that if $(z, n) \in \mathbb{R}$ and $\phi < \eta$ then coord in Q = 0 (run)

Restructure

Bargain outside option is to continue bargain protocol then conditions are

- necessary condition: firms are under a run (in ${\mathcal R}$ with $\varphi<\eta)$ or insolvent (in ${\mathcal L})$
- sufficient condition: both better-off participating
 - 1. creditors: $\alpha_{11} > \min\{1, \alpha_7 \frac{(1-\delta)q\omega k}{b}\}$
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Costs and benefits for firms

- 1. c_{11} cost (proportional to capital)
- 2. $1 \alpha_{11}$ debt haircut
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observation

if c_{11} large and $(1 - \alpha_{11})$ low \Rightarrow

firms with rollover problems restructure

Nonfinancial Firm's Recursive Problem

• V value of firm before exit shock and restructure choice with $s = (z, \omega, \phi, k, b)$

$$V(s) = (1 - \gamma) \left[1_{\{ch11\}}(s) \tilde{V}(z, n_{11}) + 1_{\{cont\}}(s) \tilde{V}(z, n) + 1_{\{ch7\}}(s) \times 0 \right] + \gamma V_{\text{exit}}(s)$$
(1)

where indicators follow from previous results, $V_{exit}(s)$ value of exiting firm details and

$$n = \pi(z, \omega, k) + (1 - \delta)q\omega k - b$$

$$n_{11} = \pi(z, \omega, k) + (1 - c_{11})(1 - \delta)q\omega k - \alpha_{11}(s)b$$

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$$n_{11} = \pi(z, \omega, k) + (1 - c_{11})(1 - \delta)q\omega k - \alpha_{11}(s)b$$

• $\tilde{V}(z,n)$ value of the solvent firm and without run is

$$\tilde{V}(z,n) = \max_{\mathbf{d},\mathbf{k}',\mathbf{b}'} \mathbf{d} + \mathbb{E}_{\left(z'|z;\omega';\phi'\right)} \left[\Lambda V\left(\mathbf{s}'\right) \right]$$
 (2)

subject to $d = n - qk' + \tilde{Q}(z, b', k')b' \ge 0$, where $\tilde{Q}(.)$ debt price without coord failure

Corporate Debt Prices

• $Q = [1 - \mathbf{1}_{ch7}(s)]\tilde{Q}$ from creditor's no profit condition

Corporate Debt Prices

- $Q = [1 \mathbf{1}_{ch7}(s)]\tilde{Q}$ from creditor's no profit condition
- Q̃ determined by (discounted) E[prob tomorrow's bankruptcy events]

$$\begin{split} \tilde{Q}\left(z,k',b'\right) &= (1-\gamma) \, \mathbb{E}_{\left(z'|z,\omega',\varphi'\right)} \left[\Lambda \mathbf{1}_{\left\{\text{continue}\right\}} \left(s'\right) \times 1 \right] \\ &+ (1-\gamma) \, \mathbb{E}_{\left(z'|z,\omega',\varphi'\right)} \left[\Lambda \mathbf{1}_{\left\{\text{Ch11}\right\}} \left(s'\right) \times \alpha_{11} \left(s'\right) \right] \\ &+ (1-\gamma) \, \mathbb{E}_{\left(z'|z,\omega',\varphi'\right)} \left[\Lambda \mathbf{1}_{\left\{\text{Ch7}\right\}} \left(s'\right) \times \mathbb{R} \left(k',b',\omega'\right) \right] \\ &+ \gamma \, \tilde{Q}_{exit} \left(z,k',b'\right) \end{split}$$

where

- $\alpha_{11}(s)$ recovery rate of creditors if restructure bargain protocol
- $R(k, b, \omega) = \min \{1, \alpha_7 (1 \delta) q \omega k / b\}$ recovery rate if liquidated
- $\tilde{Q}_{exit}(z, k', b')$ debt price conditional on exit shock Q with exogenous exit

long-term debt example

Other Agents and Equilibrium

Agents

- 1. HH's choices are determined by Euler eq, SDF Λ and labor supply eq detail
- 2. **K producer** problem sells capital at price q and has a standard aggregate capital adjustment function detail
- 3. **Creditors** price debt through no-profit condition (SDF Λ) detail

Equilibrium

Steady-state (law of motion fixed point) full definition law of motion firm distribution

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Identification

Questions

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- 2. Value of η ?

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Steps

- Calibration of standard parameters to match relevant moments of U.S. economy
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Data sources

NIPA, Compustat, Federal Judicial Center-IDB, LBD, related papers

Calibration Standard Parameters

Calibration	strategy
Cambianon	Strates

- 9 fixed and 4 fitted parameters not related to runs or bankruptcy
- params: pref, techno, stoch proc, entry/exit
- fit moments: emp, invest, balance sheet, life-cycle

Value	Calibration	
0.99	fixed to $r = 0.05$ annual	
1.16	fixed to match 58% emp rate	
0.64	fixed labor share	
0.21	fixed capital share	
0.025	fixed to match BEA quarterly	
0.90	fixed	
0.02	fixed to exit rate w/o default	
2	agg AC fixed to lit standard	
0	fixed to no net debt entrants	
0.032	internally calib	
-0.33	internally calib	
0.16	internally calib	
-0.24	internally calib	
	0.99 1.16 0.64 0.21 0.025 0.90 0.02 2 0 0.032 -0.33 0.16	

Relevant Moments

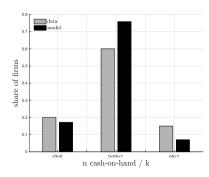
Moment

Data	Model
3.00	2.59
0.17	0.15
1.05	1.79
2.2%	0.7%
0.12	0.17
0.34	0.36
0.10	0.11
0.03	0.04
0.10	0.11
0.08	0.09
	3.00 0.17 1.05 2.2% 0.12 0.34 0.10 0.03 0.10

Balance sheet		
avg leverage: $\mathbb{E}[1_{b>0}b'/k']$	0.37	0.72
correl (n, k')	0.74	0.23
n distribution		

Data

Model



measurement

Identification of η

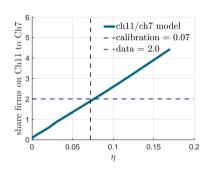
• $(\alpha_7, \psi_{11}, c_{11})$ match debt haircut under Ch 11 and Ch 7, and leverage in Ch 11

Param.	Value	Moment targeted	Data	Model
α_7	0.38	E[R]	0.27	0.29
ψ_{11}	0.89	$\mathbb{E}[lpha_{11}]$	0.69	0.82
c_{11}	0.40	E [b'/k' Ch 11]	0.73	0.67

Identification of η

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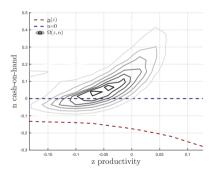
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η	0.07	E[Ch11]/E[Ch7]	2.0	1.9

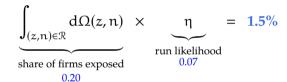


• Untargeted moments: distribution of leverage in Ch 11 and predictors of Ch 11 validation

Incidence of Rollover Problems

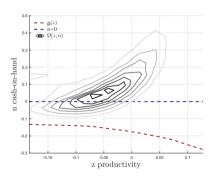
Steady state distribution $\Omega(z, n)$ before bankruptcy choice





Incidence of Rollover Problems

Steady state distribution $\Omega(z, n)$ before bankruptcy choice



$$\underbrace{\int_{(z,n)\in\mathbb{R}} d\Omega(z,n)}_{\text{share of firms exposed}} \times \underbrace{\eta}_{\text{run likelihood}} = 1.5\%$$

Result I: 1.5% of firms are subject to runs

 \Rightarrow >60% of bankruptcy events are driven by runs

Outline

- Theoretical Framework
- Identifying Firm Runs
- Macroeconomic Consequences of Firm Runs

Macroeconomic Consequences

- 1. Crises
- 2. Policies

Crisis Shock

- 3 types of short-lived unexpected aggregate shocks (η fixed):
 - 1. tfp
 - 2. cash shock $(n \downarrow)$
 - 3. credit shock $(\alpha_{11} \downarrow)$

detail shocks

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 - 2. cash shock $(n \downarrow)$
 - 3. credit shock $(\alpha_{11} \downarrow)$

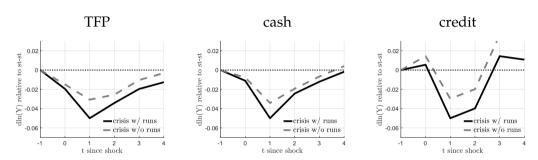
detail shocks

Questions

- contribution of runs to crises impact?
- investment heterogeneity in crises

st-st comparison

Crisis Shock Counterfactuals



detail shocks

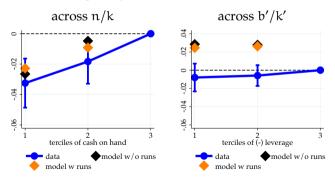
• Firm exit: cash and TFP shocks \(\); credit shock \(\) \(\) \(\) \(\)

Result II: runs amplify significantly the impact of crises

Crisis Shock Heterogeneity

- Estimate heterogeneity in Δk adjustments during crises empirical specification measurement
- Data and model simulation for Great Recession and Covid episodes

Heterogeneity of $\Delta k(crisis) - \Delta k(no crisis)$



note: simple average of both episodes for cash shock individual episode empirical results other shocks

• Direct lending policy: gov promises an alternative $Q^g(.)$ to a set of elegible firms. Then elegible firms new debt issuance resources are

$$\max\{Q\left(s,b',k'\right), \underset{government}{Q^{g}\left(.\right)}\} \times b^{'}$$

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- Policy workings: take elegible firm with $(z, n) \in \mathbb{R}$ under a run
 - faces Q = 0 then borrow from government at Q^g
 - ▶ If $d = n + \max_{k',b'} \{-k' + Q^g b'\} > 0$ then creditors know the firm could borrow from the gov to rollover the debt \Rightarrow **preclude run**

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 parametrization announcement and implementation direct lending vs credit guarantees

33

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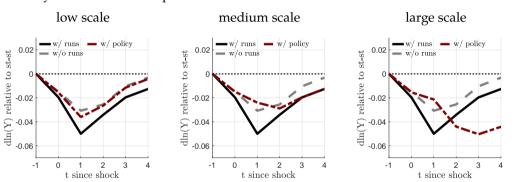
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 parametrization announcement and implementation direct lending vs credit guarantees

Question: policy effectiveness during crises

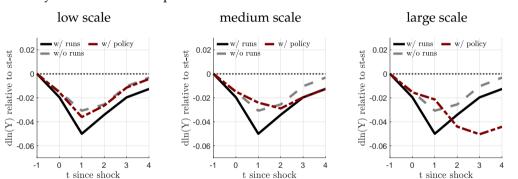
Credit Policy Implications

Policy active for first two periods and cash shock driven crisis
 TFP shock results
 fiscal losses by scale



Credit Policy Implications

Policy active for first two periods and cash shock driven crisis TFP shock results fiscal losses by scale



Result III: imperfect credit policy benefits are ambiguous

- (i) low scale policy is very potent
- (ii) high scale policy could backfire through future debt overhang

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Concluding remarks

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- Framework where rollover problems can be identified and quantified
- Results
 - 1. runs are relevant for firms' failure
 - 2. runs can amplify significantly aggregate impact of crises
 - 3. role for credit policies to prevent runs, even if imperfect

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Further research avenues

- Extensions: (i) manage liability structure (ii) heterogeneous investors

 liab structure data ex-ante cost of runs
- Other applications: e.g., sovereign debt bankruptcy procedures and self-fullfiling crises

Thank you!

Extra Slides

Related Papers

Brief and non-exhaustive review

- Quantitative macro models of firms: heterogeneous firms with corporate finance frictions
 Khan Senga Thomas 2017; Ottonello Winberry 2020 default risk; and Corbae D'Erasmo 2021 bankruptcy
- Rollover (coord) problems in macro: creditor's coord problems (run) in banks/firms/countries
 Gertler Kiyotaki 2015 banks; Cole Kehoe 2000; Bocola Dovis 2020 sov debt; Morris Shin 2004 CFin theory;
 Jackson 1986 CLaw bankruptcy
- Investment heterogeneity during crises (empirical): heterogeneity across financial distribution
 Kalemli-Özcan Laeven Moreno 2020; Almeida Campello Laranjeira Weisbenner 2012; Ebsim Faria-e-Castro
 Kozlowski 2021
- **Credit policy and C-borrowing in crisis:** credit policies implemented to address nonfinancial firms' financing problems in crises
 - Crouzet Tourre 2021; Elenev Landvoigt Nieuwerburgh 2021; Ebsim Faria-e-Castro Kozlowski 2021

Related Papers on Coordination Failures

- Bank runs: Diamond Dybvig 1983; Gertler Kiyotaki 2015; Gertler Kiyotaki Prestipino 2020
- Int'l. macro: Cole Kehoe 2000; Bocola Dovis 2020; Obstfeld 1994 and 1996
- Sunspots and business cycles: Benhabib Wong 2014; Schmitt-Grohe Uribe 2020
- Corporate finance (theoretical): Morris Shin 2004; Acharya Gale Yorulmazer 2011; He Xiong 2012; Halac Kremer Winter 2020; Zhong 2021; Zhong Zhou 2021
- Corporate law: Jackson 1986; Baird Jackson 1990; Ayotte Skeel 2013

back related papers back to paper

US Bankruptcy Code

Bankrupt firms use chapter 11 (11 U.S.C.) or 7 (7 U.S.C.) of US bankruptcy code

- Chapter 7
 - associated with firm's liquidation
 - case impartial trustee appointed to sell the bankrupt firms assets to pay creditors
- Chapter 11
 - associated with firm's restructure (or reorganization)
 - large firms also use to piecemeal liquidate the firm ("363 sale", 11 U.S.C. § 363(a))
 - debtor presents plan, and needs to be approved by judge and, ultimately, negotiated with and voted by creditors
 - provisions to preclude creditor's coordination problem
 - 1. automatic stay 11 U.S.C. § 362(a): prevents creditors demand payment
 - 2. debtor-in-possession protection 11 U.S.C. \S 1101: allows new financing
 - 3. creating creditors' committees 11 U.S.C. § 341

Bankruptcy Procedure

- Only firms that are insolvent or under a run may restructure their debt
- Recovery rate $\alpha_{11}(.)$ determined by

$$\alpha_{11}(z, k, b, \omega) = \arg \max_{\alpha_{11}} \left[\frac{V(z, n^{11}) - 0}{\text{firm's surplus}} \right]^{1 - \Xi} \left[\alpha_{11}b - R(k, b, \omega)b \right]^{\Xi}$$

where $\Xi \in [0,1]$ barg power of creditors, we need that $n_{11} > \underline{n}(z)$ and $\alpha_{11} > R(k,b,\omega) = \min\{1,\alpha_7(1-\delta)\,q\omega k/b\}$

• For computational reasons I approx the barg. Max recov rate $\{\alpha_{11}^{max}: n_{11}=\underline{n}(z)\}$ and min recov rate $\alpha_{11}^{min}=\alpha_7^{min}=R(k,b,\omega)$, then recov rate linear comb of those rates with $\psi_{11}\in(0,1)$ the weight to creditors

back fin frictions back restructure back debt price

Entry and Exit

Exogenous exit

- Firms receive exog exit shock with prob γ
- Exiting firms allowed to restructure and liquidate before producing then

$$V^{\text{exit}}(s) = 1_{\{\text{continue} \mid \text{exit}\}}(s) n + 1_{\{\text{ch}11 \mid \text{exit}\}}(s) n_{11}^{\text{exit}}$$

- Liquidate if n<0 and $n_{11}^{exit}>0$ not feasible; restructure if n<0 and $n_{11}>0$ feasible
- Price of debt conditional on exit is

$$\begin{split} \tilde{Q}_{exit}\left(z,k',b'\right) &= \mathbb{E}_{\left(s'\mid s\right)}\left[\Lambda\left\{1_{\left\{continue\mid exit\right\}}\left(s'\right) + 1_{\left\{ch11\mid exit\right\}}\left(s'\right)\alpha_{11}^{exit}\right\}\right] \\ &+ \mathbb{E}_{\left(s'\mid s\right)}\left[\Lambda 1_{\left\{ch7\mid exit\right\}}\left(s'\right)R\left(\omega',b',k'\right)\right] \end{split}$$

Entry

- Mass μ
 enter each period replacing exiting firms (for all reasons)
- Enter with capital $k = k_0$, b = 0 and $z \sim \Omega^e(z)$

back setup back value function back debt price

Liquidation Choice: Characterization

Proposition (Liquidation Choice)

Continuing firms liquidation choice $\tilde{1}_{ch7}(s, b', k') \equiv 1_{ch7}(s)$ where

$$\tilde{1}_{ch7}(s) = \begin{cases} 1 & \text{if } n < \underline{n}(z) \\ 1 & \text{if } n \in [\underline{n}(z), 0) \text{ and } \phi < \eta \\ 0 & \text{if } n \ge 0 \text{ or } n \in [\underline{n}(z), 0) \text{ and } \phi > \eta \end{cases}$$

with $\underline{\mathbf{n}}(z) \equiv -\max_{\mathbf{k}',\mathbf{b}'} \left\{ -\mathbf{k}' + \tilde{\mathbf{Q}}(z,\mathbf{b}',\mathbf{k}') \, \mathbf{b}' \right\}$ where $\tilde{\mathbf{Q}}$ debt price if $[1 - \tilde{\mathbf{1}}_{ch7}(s)] = 1$ (i.e., no liquidation today conjectured)

- Firms with n < 0 are exposed to runs independently of their productivity z
- If \tilde{Q} increasing in z then $\underline{n}(z)$ decreasing in z

back charact back eq

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Liquidation Choice: More General Setup

Long-term debt

- assume portion debt m matures each period (randomly) and nonmatured pays cupon c
- cash-on-hand: $n = \pi + q\omega(1 \delta)k [m + (1 m)c]b$
- external funds: Q(.)[b' (1 m)b] qk'
- default threshold: if $n \in [\underline{n}(z, b), 0)$ exposed to runs and $n < \underline{n}(z, b)$ insolvent
- (recursive) debt prices (simplified = no bkrptcy, no exit, no discount, c = 0, $\alpha_7 = 0$):

$$\tilde{\mathbb{Q}}(z,k',b') = \mathbb{E}_{\mathbf{z}'|\mathbf{z}}\left[\left\{\mathbf{1}_{\mathfrak{n}'\geq 0} + (1-\eta)\,\mathbf{1}_{\mathfrak{n}'\in\left[\underline{n}(z',b'),0\right)}\right\}\left\{(1-m)\,\tilde{\mathbb{Q}}(z',k'',b'') + m\right\}\right]$$

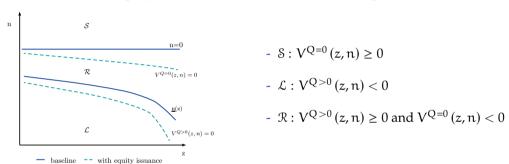
More general (assume c = 0 for exposition)

- profits $\pi(\mathbf{z}, k)$ gral \mathbf{z} process, invest $\iota\left(k, k'\right)$ allow for idio k frictions and long-term debt
- dividends (if no run) are $d = \pi(\mathbf{z}, \mathbf{k}) \iota(\mathbf{k}, \mathbf{k}') \mathfrak{bm} + \tilde{\mathbf{Q}}(.)(\mathbf{b}' (1 \mathbf{m})\mathbf{b})$
- multiple eq if $\max_{k',b'} d \ge 0$ and $n \equiv \pi(\mathbf{z},k) bm \iota(k,0) < 0$ hold

back liquidation back debt price

Liquidation Choice: Costly Equity Issuance

• Firms can issue equity e < 0 at cost $\phi(e)$, which is decreasing in e and unbounded.



• Where $V^{Q=0}$ firm problem with costly equity issuance where Q=0 and $V^{Q>0}$ same but with Q>0

HH Problem

HH in equilibrium determines

$$\Lambda' = \beta \frac{U_C(C', L')}{U_C(C, L)}$$

$$1 = E \left[\beta \frac{U_C(C', L')}{U_C(C, L)} (1 + r) \right]$$

$$w = -\frac{U_L(C, L)}{U_C(C, L)}.$$

with utility function $U_C(C, L) = \ln C - \Omega L$

back back eq

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Capital Producer

There is a representative aggregate capital producer that maximizes

$$\max_{I} q\Phi\left(\frac{I}{K}\right) - I$$

where I is the amount of final goods used to produce capital, K is the aggregate k stock, and Φ (.) is the aggregate capital adjustment cost function. FOC:

$$q = \frac{1}{\Phi'\left(\frac{I}{K}\right)}$$

• time-varying q and \Re (.) \rightarrow financial accelerator mechanism (Bernanke, Gertler & Gilchrist 1999).

back back eq

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Steady-State Equilibrium

Steady-state equilibrium in this economy is Vfunctions of continuing firms $\{V, \tilde{V}\}$, decision rules $\{b', k', l\}$, aggregates $\{Y, C, I\}$, price schedule Q(.), interest rate r, prices $\{q, w\}$, default choices 1(.), recov rates $\alpha_{11}(.)$ and distribution of firms $\{\Omega(.)\}$

- HHs choices are determined by Euler eq, SDF and labor supply eq detail
- price of capital q determine in K producer problem detail
- debt price satisfy no-profit condition of fin intermediaries detail
- given prices, firm's dec. rules solve the producing firm's problem detail and default choices are consistent with Default Propositions
- recovery rates satisfy bargaining protocol
- markets clear (labor, resources)
- distribution of firms fixed point in law of motion detail

Law of Motion States

Let Ω be the distribution of firms that produce which they a mass of 1, $\tilde{\Omega}$ the distribution of incumbent firms at the begining of the period, g and \hat{g} the pdf of ω and ϕ respectively, p the conditional pdf of the productivity shocks ϵ_z , and Ω^e the distribution of entrant firms. To define the equilibrium first we need to determine the law of motion of the distribution. Distribution of firms that produce is

$$\begin{split} \Omega\left(z,n\right) &= (1-\gamma) \int \left[\mathbf{1}_{\left\{ch11\right\}}\left(s\right) \mathbf{1}_{\left\{n^{11}\left(z,k,b,\omega\right)=n\right\}} + \mathbf{1}_{\left\{cont\right\}}\left(s\right) \mathbf{1}_{\left\{n\left(z,k,b,\omega\right)=n\right\}} \right] d\tilde{\Omega}\left(s\right) \\ &+ \tilde{\mu}\left(1-\gamma\right) \int \left[\mathbf{1}_{\left\{ch11\right\}}\left(s\right) \mathbf{1}_{\left\{n^{11}\left(z,k_{0},0,\omega\right)=n\right\}} + \mathbf{1}_{\left\{cont\right\}}\left(s\right) \mathbf{1}_{\left\{n\left(z,k_{0},0,\omega\right)=n\right\}} \right] \hat{g}\left(\varphi\right) g\left(\omega\right) d\varphi d\omega d\Omega^{\mathcal{C}}\left(z\right) \\ &+ lom \mid exit \end{split}$$

The distribution of incumbent firms at the beginning of the period $\tilde{\Omega}(z, \omega, k, b, \phi)$ is

$$\tilde{\Omega}\left(s'\right) = \int 1_{\left\{k'(z,n)=k'\right\}} 1_{\left\{b'(z,n)=b'\right\}} \hat{g}\left(\varphi'\right) g\left(\omega'\right) p\left(\varepsilon_z \mid \rho_z z + \varepsilon_z = z'\right) d\varepsilon_z d\Omega\left(z,n\right)$$

back eq def back eq paper

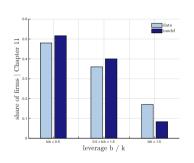
Data Sources, Sample and Some Definitions

Compustat

- Two samples (accounting changes after 2018, see Ma's online notes)
 - ► Pre-covid = 1980-2017 (n=179k annual, n=426 k quarterly)
 - Covid = 2019-2020 (n=14k quarterly)
- Sample selection: nonfinancial, k > 0, assets > 0, drop outliers and short-spell (<20 q spell)
- Key definitions:
 - \triangleright n = profits + liq value capital net liquid liabilities
 - profits = F1.oiadpq where F1 = one period ahead in the data
 - ▶ net liquid liabilities = 1ctq cheq
 - ▶ liq value capital = invtq × ω_{inv} + rectq × ω_{rec} + ppentq × ω_{ppentq} + acoq where ω_x is liq value rate (from Kermani Ma 2020) of asset class x
- Identify bankrupt firms that operate following Corbae D'Erasmo 2021. Use footnote to total assets and deletion information (dlrsn and dldte). Bankrupt firms:
 - 1. report adoption accounting under Ch11, or bankrupt and not deleted
 - 2. data available next period

Untargeted Moments of Bankruptcy

Distribution of leverage b'/k' firms in Chapter 11



Predictors of Chapter 11

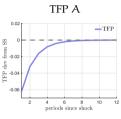
	dependent variable: $1_{i,t}^{chl1}$					
	(1)		(2)		(3)	
	data	model	data	model	data	model
$n_{i,t-1}/k_{i,t}$	-0.39 (0.03)	-0.05			-0.39 (0.10)	-0.45
$b_{i,t}/k_{i,t}$			0.11 (0.04)	0.03	-0.29 (0.09)	-0.41
$log(k_{i,t-1})$	-0.50 (0.12)	-0.06	$^{-0.52}$ (0.12)	-0.06	-0.49 (0.12)	-0.10
$d \log(sales_{i,t-1})$	-0.04 (0.00)	-0.03	-0.04 (0.00)	-0.02	-0.04 (0.00)	-0.01
Sector FE Firm FE Year FE	Y Y Y	Y	Y Y Y	Y	Y Y Y	Y
Observations	370,973		373,362		370,973	

empirical specification: $1_{i,t}^{ch11} = \beta X_{i,t-1} + \alpha_t + \alpha_i + \alpha_s + \varepsilon_{i,t}$

Crisis Shocks

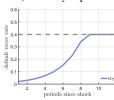
- Shocks unexpected and perfect foresight of path
- Temporary with persistence 0.5
- Definition of shocks:
 - ► TFP A: prod funct $Azf(k\omega, l)$
 - ► Cash ξ: reduction in n by ξk
 - ightharpoonup Credit: recov rate if liquidated α_7

MIT shocks path





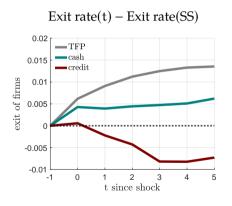
Credit (Recovery liquidation) α_7

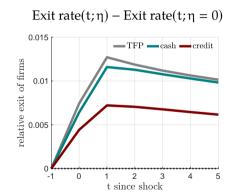


back exercise back results

Steady State Comparison

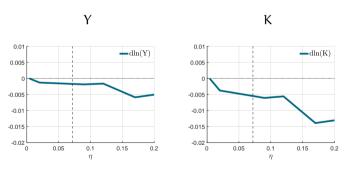
• Firm exit dynamics during crisis experiments



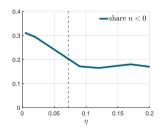


Steady State Comparison

- Variables: aggregate income Y, capital, K and share of firms with $\mathfrak{n} < 0$
- Comparison: steady state for different η



share of firms with n < 0



notes: log difference relative to st-st with $\eta=0$ for Y and K and levels for share of firms

Heterogeneous Investment Response Empirical Specification

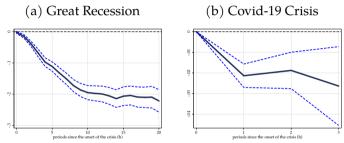
 Diff-in-diff crisis event estimate similar to Kalemli-Özcan Laeven Moreno 2020

$$\Delta \log(k_{it}) = \underbrace{\sum_{j=1}^{J} \beta_{j}^{n} \left(Q_{it}^{nj} \times crisis_{t} \right)}_{\text{heterogeneity across } n/k} + \underbrace{\sum_{j=1}^{J} \beta_{j}^{b} \left(Q_{it}^{bj} \times crisis_{t} \right)}_{\text{heterogeneity across } b/k} + \underbrace{\Lambda' Z_{it}}_{\text{controls}} + \epsilon_{it}$$

let $x_{it} = \{b_{it}, l_{it}\}$ firm i at period t with

- demeaned by sector $\hat{x}_{it} = x_{it} \mathbb{E}_s[x_{it}]$.
- $\Delta \log(k_{it}) = \log(k_{it+h}) \log(k_{it})$ with h peak-to-trough length
- crisis_t indicates if a crisis happens during the period considered
- $Z_{i,t}$: sales growth, log firm size, firm FE, sector FE

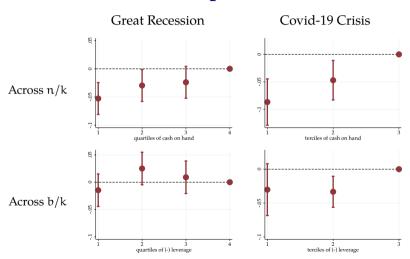
Recent Crisis Episodes in U.S.



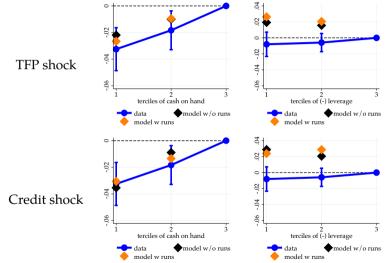
 Δ Capital Accumulation

 β_h : $\log(k_{i+h}) - \log(k_{i+h}) = \alpha_i + \beta_h \operatorname{crisis}_t + \varepsilon_{i+h}$

Investment Adjustment Heterogeneity Recent Crisis Episodes in U.S.



Crisis Shock Heterogeneity: Other Shocks



Credit Policy Setup

- Announced unexpectedly at t = 0 (same period of shocks) for $T \ge 0$ periods and implemented at $j \in [0, T]$
- Eligible firms $(z, n) \in \mathcal{P}$ offer sequence of $\{Q_t^g(.)\}$
- Policy \mathcal{P} and labor taxes τ fixed across time
- Budget constraint from $t \ge 1$

$$\tau w_t L_t + B_t + B_{t-1,t}^g = B_t^g + (1 + r_{t-1}) B_{t-1}$$

 B_t^g amount lent, $B_{t-1,t}^g$ lent at t-1 and recovered at t

Credit Insurance Policy: First Best and Trade-off

Proposition (Credit Insurance Policy)

Assume that the government implements the credit insurance policy next period and is predictable today:

- 1. First best policy: $Q^g = \tilde{Q}$ then no risk of runs and qualified firms indifferent between using public or private credit.
- 2. No screening: fix z^g such that $Q^g = \tilde{Q}(z^g, k', b')$ with firms qualified for credit those with $0 > n > \underline{n}(z^g)$. This policy faces a trade-off between lowering firm run risk and greater misallocation.
- 1st best policy eliminates runs and firms don't use the program's credit
- W/o screening greater z^g will preclude more runs, but firms with $z < z^g$ will draw funds (zombification)

back trade-off

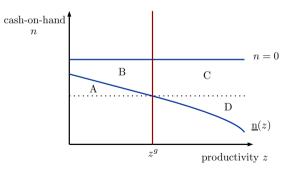
Direct Lending vs. Credit Guarantees

- Examples: direct lending ≈ Fed's PMCCF SMCCF and credit guarantee ≈ PPP
- In the theory policies are
 - ▶ direct lending (DL): alternative Q^g(.) detail theory
 - redit guarantee (CG): repay $\alpha_q^r \ge \alpha^r$ in case of default
- Workings relative to runs
 - DL affects payoffs (outside eq) and could coord creditors in good eq
 - ightharpoonup CG relaxes $\underline{\mathbf{n}}(z)$ but doesn't *directly* preclude runs

Credit Policy Trade-off

Stylized example of 1 period policy in PE and two extreme cases

- 1. Perfect screen of $z: Q^g = \tilde{Q}$ and then remove coord failures for "free"
- 2. No screen of z: gov lends to elegible firms $n \in (0, \underline{n}(z^g)]$ firms at $\tilde{Q}(z^g, k', b')$, with z^g parameterizing policy scope



 $A \cup B \cup C$: elegible

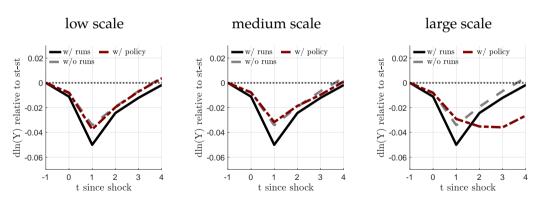
D: excluded

 $A \cup B$: subsidized credit

 $B \cup C$: runs precluded

Credit Policy Implications: TFP shock

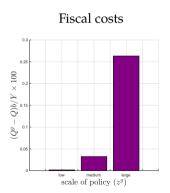
• Policy active for first two periods and TFP shock driven crisis back cash shock results

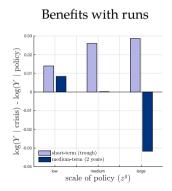


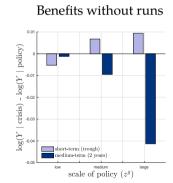
Credit Policy Implications: TFP shock

• Compute fiscal costs, short and long term benefits back

Costs and benefits







Liability Structure Data

• Debt maturity (Compustat)

• Number of creditors from bankruptcy filings to Chapter 11 (FJC-IDB)

00 101 to 1,	,000 >1,000
0.19 0.04	

Creditors

How Costly are Firm Runs?

- (ex-ante) Cost computed as $\tilde{Q}(z, k', b'; \eta) \tilde{Q}(z, k', b'; 0)$
- Only 2.2% of the firms face a cost of runs higher than intermediation spread

Cost of runs (in annual spread terms) distribution

