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Is This Time Different: Do Bank CEOs Learn From Crisis Experiences?

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"I know we have crises every five or ten years."

Jamie Dimon, J.P. Morgan's chairman and chief executive, 2010

"The reckless loan practices of 20 years ago has made him a more conservative and better banker today."

Pat Hickman, CEO of Happy State Bank in Texas, 2012

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Motivation

• Empirically, we observe cross-sectional differences in bank performance and survivals

- $\ast\,$ GB&T: -25.5% quarterly risk-adjusted return 07-09, fail
- * JPMORGAN: 1.2% , survive

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Motivation

• Empirically, we observe cross-sectional differences in bank performance and survivals

- * GB&T: -25.5% quarterly risk-adjusted return 07-09, fail
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- We also observe heterogeneity in the risk management and culture of prudence in banks

* (Ellul and Yerramilli 2013)

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• This paper asks whether experiencing a more intense banking crisis in the past affects CEOs' management styles and bank survivals in the future Introduction O●○○ Methodology & Data

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Research Questions

- Main Tests: Do Crises Experiences of CEOs Matter for Banks?
- Channel Tests: How do Experiences Matter?
- Testing Ground:
 - * I will explain banking outcomes and practices in 1999-2009 using CEOs' *experiences* with the banking crisis in 1985-1990
- Explore cross-state time varying bank failure rate during Savings and Loan Crisis (S&L).

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Setting - Bank Failure Rates by States during the 1980s

My identification comes from the time-series and cross-sectional differences of state-level bank failure rates during the S&Ls crisis



state — CA ···· NC --· NY - - TX ···· VA

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Preview-Findings

- This paper proposes an *Intensity* measure for banking crisis experiences at the CEO level
 → Exploit the variation in state-level bank failure rates during the S&Ls crisis
- This paper shows that crisis experiences of CEOs affect survival rates and bank management

 \rightarrow Characterize bank features associated with experiences: less likely to fail and take less systemic risk

• This paper demonstrates channels through which experiences matter for banks

 \rightarrow Pin-down policy channels: business model exposure to interest rate shocks, credit and liquidity risk management

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Independent Variable: Banking Crisis Intensity

• Intensity_c = log
$$\left(1 + \max_{t} \left(\frac{\text{Failed Deposits in Employment State}_{st}}{\text{Total Deposits in Employment State}_{st}}\right)\right)$$

S&Ls Graph s : state where CEO was at c : CEO t : year

• An example: XYZ stayed in Texas in 1985 and 1986, and moved to LA in 1987



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Identification Strategies

• Panel regression specification:

 $Y_{ict} = \alpha + \beta_1 Intensity_c + f_i + f_t + \lambda_1 C_{ct} + \lambda_2 X_{it-1} + \eta_{ict} \quad (1)$

X : BHC controls $\ C$: CEO controls $\ i$: BHC $\ c$: CEO $\ t$: year

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Identification Strategies

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 $Y_{ict} = \alpha + \beta_1 Intensity_c + f_i + f_t + \lambda_1 C_{ct} + \lambda_2 X_{it-1} + \eta_{ict} \quad (1)$

 $X: \, \mathrm{BHC} \, \, \mathrm{controls} \quad C: \, \mathrm{CEO} \, \, \mathrm{controls} \quad i: \, \mathrm{BHC} \quad c: \, \mathrm{CEO} \quad t: \, \mathrm{year}$

• Causality? A common issue in CEO literature

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Identification Strategies

• Panel regression specification:

 $Y_{ict} = \alpha + \beta_1 Intensity_c + f_i + f_t + \lambda_1 C_{ct} + \lambda_2 X_{it-1} + \eta_{ict} \quad (1)$

X : BHC controls $\ C$: CEO controls $\ i$: BHC $\ c$: CEO $\ t$: year

- Causality? A common issue in CEO literature
 - * Bank-CEO Matching? State-CEO Matching?
 - * Shocks: Unanticipated state level banking crises
 - $\ast\,$ Test 1: CEO turnovers
 - $\ast\,$ Test 2: CEO hometown shocks

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Sample

- 241 bank holding companies (BHC) from 1999 to 2009
- Key LHS and BHC controls:
 - * Annual stock market performance data from Center for Research in Security Prices (CRSP)
 - * Annual BHC consolidated financial data from FR Y9C statements and Standard & Poor's Compustat
- Key RHS and CEO controls:
 - * CEO-related information from BoardEx
 - * Marquis Who's Who.

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Main Tests: Do Experiences Matter in Times of Crises? - Survivals

- Question
 - * Are BHCs led more experienced CEOs less likely to fail during the recent crisis? YES
- LHS Variables
 - * Failure 1: being closed by FDIC or delisted
 - * Failure 2: including Troubled Asset Relief Program receivers
- Probit Model
 - * Cross-Sectional Test: Financial Crisis (07-09)

$$Failure_{ic} = \alpha + \beta_1 Intensity_c + \lambda_1 C_c + \lambda_2 X_i + \eta_{ic}$$

 $X:\, {\rm BHC \ controls} \quad C:\, {\rm CEO \ controls} \quad i:\, {\rm BHC} \quad c:\, {\rm CEO}$

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Main Tests: Do Experiences Matter? – Table 2a

Full-Table

Table	Failure during Financial Crisis (07-09) BHCs without CEOs Turnovers during FC							
	Failure1	Failure1	Failure2	Failure2	Failure1	Failure1	Failure2	Failure2
Intensity	-0.041**	-0.019	-0.063**	-0.038^{*}	-0.052^{**}	-0.024	-0.066**	-0.050^{*}
	(-2.41)	(-1.45)	(-2.85)	(-1.74)	(-2.55)	(-1.44)	(-2.59)	(-1.74)
CEOAge		-0.002		0.001		-0.002		0.003
		(-0.95)		(0.27)		(-0.78)		(0.57)
HighDegree		0.016		0.050		0.021		0.057
		(0.59)		(0.96)		(0.63)		(0.90)
Female		0.064		0.221^{**}		0.075		0.260^{**}
		(1.44)		(2.30)		(1.30)		(2.15)
Ret_{1998}		-0.077		-0.149		-0.082		-0.142
		(-0.90)		(-1.05)		(-0.69)		(-0.76)
BM_{2006}	0.022	0.014	0.091^{*}	0.072	0.020	0.020	0.100	0.104
	(0.57)	(0.69)	(1.79)	(1.47)	(0.41)	(0.65)	(1.59)	(1.45)
$Size_{2006}$	-0.004	0.017	0.006	0.017	-0.003	0.020	0.007	0.021
	(-0.18)	(0.96)	(0.23)	(0.65)	(-0.12)	(0.88)	(0.21)	(0.61)
$Tier1_{2006}$	1.959	1.120	1.936	-0.401	2.138	1.138	1.044	-1.769
	(1.37)	(1.63)	(1.02)	(-0.20)	(1.24)	(1.18)	(0.47)	(-0.68)
$Beta_{2006}$	-0.007	-0.026	-0.057	-0.070	0.002	-0.025	-0.026	-0.061
	(-0.16)	(-0.73)	(-0.96)	(-1.08)	(0.03)	(-0.54)	(-0.38)	(-0.75)
Observations	198	121	198	121	168	98	168	98

Marginal effects; t statistics in parentheses; * p < 0.10, ** p < 0.05, *** p < 0.001

At the mean level of Intensity, a marginal increase in intensity is associated with 5% lower probability of bank failure (8.3% on average during 07-09)

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Main Tests: Do Experiences Matter in Normal Times? - Survivals

• Question

* True for normal times? YES

- LHS Variables
 - * Failure 1
 - * Failure 2
- Probit Model
 - * Panel Test: Post S&L Crisis (99-09)

 $Failure_{ict} = \alpha + \beta_1 Intensity_c + f_t + \lambda_1 C_{ct} + \lambda_2 X_{it-1} + \eta_{ict}$

i: BHC c: CEO t: Year

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Main Tests: Do Experiences Matter? – Table 2b

Full-Table								
Ta	ble 2b: Pan	el Probit Re	gressions of	Bank Failu	re during <mark>Po</mark>	st S&L Cris	sis (99-09)	
	Failure1	Failure1	Failure1	Failure1	Failure2	Failure2	Failure2	Failure2
$Intensity_t$	-0.004**	-0.004**	-0.004**	<mark>-0.005*</mark>	-0.005**	-0.004*	-0.005**	-0.005**
	(-2.30)	(-2.10)	(-2.08)	(-1.89)	(-2.20)	(-1.89)	(-2.23)	(-2.42)
Ret_{1998}				-0.025				-0.056**
				(-1.26)				(-1.99)
BHC Controls	Ν	Υ	Y	Υ	Ν	Υ	Υ	Y
CEO Controls	Ν	Ν	Υ	Υ	Ν	Ν	Υ	Υ
Year FE	Υ	Υ	Υ	Υ	Υ	Υ	Υ	Υ
Observations	1,170	1,108	1,021	1,021	1,170	1,108	1,021	1,021

At the mean level of Intensity, a marginal increase in intensity is associated with 0.5% lower probability of bank failure (3.3% average failure rate)

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Take Less Systemic Risk – Methodology

- Given the experiences of systemic fallout, will CEOs be more averse to systemic risk and uncouple from peers? YES
- Panel regression specification

 $Y_{ict} = \alpha + \beta_1 Intensity_c + f_i + f_t + \lambda_1 C_{ct} + \lambda_2 X_{it-1} + \eta_{ict}$

- Firm and year fixed effects, clustering at the CEO level
- Measures of systemic risk
 - * CMV_bank (CMV_bankw): stock return co-movement with the banking industry portfolio (weighted) (Barberis et al. 2005)
 - * *MES_mkt*: marginal expected shortfall (Brownlees and Engle 2010, Acharya et al. 2013)

$$MES_{it-1}(C) = E_{t-1}(r_{it}|r_{mt} < C)$$

* Beta: CAPM market beta

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Take Less Systemic Risk – Table 3

Full-Table								
	CMV_bank	CMV_bank	CMV_bankw	CMV_bankw	MES_mkt	MES_mkt	Beta	Beta
$Intensity_t$	-0.024**	-0.032**	-0.020*	-0.025**	0.002**	0.003**	-0.080**	-0.098**
	(-2.36)	(-3.04)	(-1.83)	(-2.30)	(2.29)	(2.75)	(-2.76)	(-2.86)
BHC Controls	Y	Y	Y	Y	Y	Y	Y	Y
CEO Controls	Ν	Y	Ν	Υ	Ν	Y	Ν	Υ
Year & BHC FEs	Y	Y	Y	Y	Y	Y	Y	Υ
Observations	1499	1197	1499	1197	1498	1196	1489	1189
Adjusted \mathbb{R}^2	0.856	0.853	0.878	0.880	0.694	0.718	0.774	0.768

One percentage point of RHS (1.005%)state-wise bank failure rate is associated with 3.1 percentage lower co-movement, or one standard deviation of intensity is associated with $1.27^*3.1=3.9$ percentage point lower co-movement(36.5)

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Channel Tests: Policy Framework

So experiences matter more bank survivals and systemic risk taking! What could be the tapped policies under their influence of experiences?



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Channel Tests: Resilience to Interest Rate Shocks

- Are their business models resilient to interest rate shocks? YES
- LHS: interest rate betas absolute value of the BHC stock return sensitivity to Interest Rate Shocks

Table 4: Interest Rate Betas										
	Prime_d1 Prime_res Libor_d1 Libor_res Termspread_d1 Termspread_res									
Intensity	-0.005**	-0.006**	-0.018**	-0.016**	-0.004**	-0.004**				
	(-2.50)	(-2.14)	(-3.16)	(-2.39)	(-2.16)	(-2.09)				
BHC Controls	Y	Y	Y	Y	Y	Y				
CEO Controls	Ν	Υ	Ν	Υ	Ν	Υ				
Year & BHC FEs	Y	Y	Υ	Υ	Y	Υ				
Observations	1,498	1,196	1,498	$1,\!197$	1,483	1,188				
Adjusted \mathbb{R}^2	0.190	0.184	0.238	0.210	0.058	0.058				

Interpretation: one standard deviation of RHS is associated with 0.63 percentage point lower interest rate beta (mean: 2.38)

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Channel Tests: Credit Risk

• Are BHCs led by more experienced CEOs more cautious with bad loans? YES

• LHS: nonperforming loans, net charge-offs, provisions

Table 5: Credit Risk									
	$Net\ charge-offs Net\ charge-offs Provision Provision BadLoan BadLoa$								
Intensity	<mark>-0.039**</mark>	-0.042^{**}	-0.050^{**}	-0.053^{**}	-0.071	-0.092^{**}			
	(-2.61)	(-3.06)	(-2.56)	(-2.70)	(-1.51)	(-1.98)			
BHC Controls	Y	Y	Y	Y	Y	Y			
CEO Controls	Ν	Υ	Ν	Υ	Ν	Υ			
Year & BHC FEs	Υ	Υ	Υ	Υ	Υ	Y			
Observations	1,498	1,196	1,498	1,197	1,483	1,188			
Adjusted \mathbb{R}^2	0.551	0.565	0.579	0.581	0.658	0.638			

Interpretation: one standard deviation of RHS is associated with 0.053 percentage lower net charge off (mean: 0.25)



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Channel Tests: Liquidity Risk

• Are BHCs led by more experienced CEOs hold more liquid assets on the balance sheet? YES

• Liquid asset1 (2) = cash + pledged securities + held-to-maturity securities + available-for-sale securities (+ federal funds sold)

Table 6: Liquidity Risk										
	Liquid asset1 Liquid asset1 Liquid asset2 Liquid asset2 US Treasury US Treasur									
Intensity	<mark>0.008*</mark>	0.008*	0.008*	0.008*	0.003*	0.003*				
	(1.83)	(1.83)	(1.69)	(1.68)	(1.91)	(1.85)				
BHC Controls	Y	Y	Y	Y	Y	Y				
CEO Controls	Ν	Y	Ν	Y	Ν	Υ				
Year & BHC FEs	Y	Y	Y	Y	Υ	Υ				
Observations	1,498	1,196	1,498	1,197	$1,\!483$	1,188				
Adjusted \mathbb{R}^2	0.708	0.721	0.681	0.681	0.750	0.745				

Interpretation: one standard deviation of RHS is associated with 2.29 percentage higher liquid asset holdings (mean:35 percentage point)

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Endogeneity Test 1 – CEO Turnovers

- Concerns: Bank-CEO matching drives the effect of *Intensity*
- Strategy: Exogenous CEO turnovers that are not driven by bank fundamental or condition changes
- We have 70 BHCs going through exogenous turnovers
- Retirement age is higher in banking
- Turnovers unlikely to be associated with managerial performance or changes of firm conditions.

Table 7: CEO Turnovers									
Failure1 CMV_bk MES Beta Net charge-offs Liquid asset1 Termsprea									
$Intensity_t$	-0.006^{*}	-0.052^{**}	0.002^*	-0.101	-0.056^{**}	0.014**	-0.008^{**}		
	(-1.74)	(-2.35)	(1.67)	(-1.63)	(-3.08)	(2.33)	(-2.16)		
CEO & BHC Controls	Y	Y	Y	Y	Y	Y	Y		
Year & BHC FEs	Y	Y	Υ	Υ	Υ	Υ	Υ		
Observations	432	423	423	423	488	423	396		
Adjusted \mathbb{R}^2		0.855	0.752	0.760	0.631	0.814	0.094		

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Endogeneity Test 2: CEO Hometown Shocks

- Concerns: CEOs self select into states in the 1980s and receive corresponding shocks
- Strategy: Places of birth are beyond CEOs' choices but events taking place there remain salient due to connections
- 44 CEOs whose places of birth are identified. 6 cases outside US
- RHS: Bank failure rates of the hometown states during S&Ls crisis

Table 8: Hometown Bank Failures during S&Ls								
	CMV_bk	UST	$Terms pread_d1$	Net charge-offs				
$Intensity_Birth$	-0.013** (-2.52)	$\begin{array}{c} 0.007^{**} \\ (2.58) \end{array}$	-0.001* (-1.96)	-0.020** (-2.53)				
CEO & BHC Controls	Y	Y	Y	Y				
Year FE	Y	Y	Y	Υ				
Observations	118	118	112	118				
Adjusted \mathbb{R}^2	0.607	0.790	0.043	0.279				

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Heterogeneous Effects

• Effects on credit and liquidity risks are stronger if CEOs worked for the Banking Sector in 1980s (89%)

Table 9a: CEOs Who Worked for the Banking Sector during S&Ls									
Netchargeoff Badloan Provision LiquidAsset1 LiquidAsset2 U.									
Intensity	-0.053^{*}	-0.107**	-0.058**	0.015**	0.010^{*}	0.008**			
	(-1.90)	(-2.46)	(-2.59)	(2.27)	(1.95)	(2.73)			
CEO & BHC Controls	Y	Y	Y	Y	Y	Y			
Year & BHC FEs	Y	Υ	Υ	Y	Υ	Υ			
Observations	1048	1049	1042	1048	1048	1027			
Adjusted R^2	0.653	0.599	0.688	0.904	0.900	0.734			

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Heterogeneous Effects

• Effects on credit and liquidity risks are stronger if CEOs were in C-suites before (47%)

	Table 9b: CEOs Who Held C-suites Positions during S&Ls								
	Netcharge of f	Badloan	Provision	LiquidAsset1	LiquidAsset2	USTS			
Intensity	-0.058*	-0.111**	-0.052***	0.014	0.020^{*}	0.009*			
	(-1.83)	(-2.04)	(-3.57)	(1.36)	(1.70)	(1.72)			
CEO & BHC Controls	Y	Y	Y	Y	Y	Y			
Year & BHC FEs	Y	Y	Y	Y	Y	Y			
Observations	477	478	476	478	478	470			
Adjusted \mathbb{R}^2	0.681	0.661	0.694	0.928	0.906	0.715			

• No differential effects between big and small banks

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Findings

• Bank CEOs learn!

- * Banks with CEO experiencing S&Ls crisis are less likely to fail!
- * Those CEOs take lower systemic risks!

• Potential Channels:

- * Business model exposure to interest rate shocks
- * Credit risk
- $\ast\,$ Liquidity risk

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Implications

- Should we update agent types in corporate theories if crisis experiences matter?
- Is there path dependence of systemic risk taking?
- Are we missing element of human capital in the current regulatory landscape?
- New source of time-varying managerial traits, manager styles and the culture of prudence

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THANK YOU VERY MUCH!