Entrepreneurial Wealth and Employment: Tracing Out the Effects of a Stock Market Crash

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December 16, 2022

Journal of Finance forthcoming

Abstract

I provide evidence that adverse shocks to the wealth of business owners during the Financial Crisis had large effects on their firms' financing, employment, and investment. My empirical approach exploits the dispersion in stock returns during 2008–09 as a source of exogenous variation in the wealth of Norwegian entrepreneurs who held listed stocks. The effects on investment and employment are driven by young firms who obtain differentially less bank financing following an owner wealth shock. Employment primarily adjusts through reduced hiring. My findings highlight equity-financing frictions and the procyclicality of entrepreneurial wealth as important channels through which economic shocks amplify.

Keywords: Financial Crisis, Employment, Entrepreneurs, Equity Financing

JEL codes: G01, G32, G50, E24, J23

Recent research has shown that financial shocks have large effects on employment during economic crises. This literature has underlined the importance of securing bank financing to firms, which has had extensive and persistent policy implications (Crouzet and Tourre, 2020). However, this literature is largely mute on the effects of adverse shocks to the financial health of business owners who serve as the primary source of funding for many small firms. While economic crises see disruptions to bank lending, they also see large drops in the wealth and liquidity of business owners. In the presence of financial frictions, this procyclicality of entrepreneurial wealth may work

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¹The 2016 Small Business Credit Survey finds that the most common source of financing for the 61% of employer firms facing financial challenges was the personal funds of the owners.

to amplify the consequences of adverse economic shocks. This idea lies at the heart of the financial accelerator framework by Bernanke, Gertler, and Gilchrist (1999), an important underpinning of modern macroeconomics. Adverse shocks to entrepreneurial wealth are likely to come at the worst of times: when credit supply is weak, revenues are low, and business uncertainty is high. Adverse wealth shocks may reduce entrepreneurs' ability to finance their firms as well as their willingness to do so by affecting their risk tolerance or beliefs about the future. Yet evidence of how shocks to entrepreneurs' wealth affect the real economy, through the employment and investment of their firms, is lacking. This presents a limitation to our understanding of how economic shocks amplify and thereby which policies should be pursued to curtail unemployment during a crisis.

The scarcity of empirical research on this subject is rooted in long-standing data limitations and identification challenges. Data that links information on business owners' wealth with the characteristics of their firms is limited. To the extent that it is obtainable, we face the issue that the level of (or any changes to) the owners' wealth is likely highly correlated with, or even endogenous to, their firms' investment opportunities. I overcome these challenges by using administrative tax data from Norway that contains detailed financial information for all Norwegian residents and firms. The central new ingredient is a stockholder registry, which allows me to link detailed data on firms and entrepreneurs through private-firm ownership records. In addition, the security-level data on ownership in listed stocks allows me to quantify idiosyncratic wealth shocks, which are based on the exogenous forward returns of the stocks in the entrepreneur's pre-crisis portfolio. These data, together with educational records and employment registers, enable a detailed investigation of the real effects of shocks to entrepreneurial wealth. Using stock market losses as the identifying variation in wealth allows me to examine the real effects of stock market crashes, by tracing out the effect of the stock market crash of 2008 to investors, the private firms they own, and their employees.

I first exploit the fact that the wealth shocks are idiosyncratic—rather than driven by local conditions, such as house prices. This facilitates a novel test of the hypothesis that the firms of adversely-shocked entrepreneurs can substitute toward equity financing from other, unshocked, investors.² I find that a moderate financial wealth loss of 10% reduces the probability of an equity injection by a sizable 22%. The finding that idiosyncratic shocks to the wealth of an existing owner substantially lowers the probability of equity injections is consistent with firms facing important frictions in establishing new equity-financing relationships. I find that these effects are significantly stronger for more levered firms. When considering the effects on equity extraction in the form of dividends, I find little effect for the average firm, but considerable heterogeneity. Less adversely

²When identifying from shocks that operate through house prices, alternative local investors may have a decreased ability to invest in new or other firms through, for example, the collateral channel (Chaney, Sraer, and Thesmar, 2012)

shocked, more levered firms pay out less dividends. This is consistent with wealthier entrepreneurs foregoing dividends from more levered firms during the crisis. More liquid firms, however, pay out substantially more dividends to owners who experience adverse wealth shocks.

Using the employer-employee register, I continue by exploring the real economic effects in terms of employment outcomes. I find that wealth shocks only affect employment growth when the ex-ante wealth of the owner is similar in magnitude to the potential financing needs of firm. These are the cases where the owner would be a viable source of financing absent a wealth shock, but not necessarily resilient to sizable portfolio losses. In these cases, I find economically large effects: A loss of 10% of the owner's financial wealth reduces employment growth from 2007 to 2010 by about 5 percentage points. A central finding is that these effects are almost entirely driven by younger firms, whose employment shows no sign of recovery even five years after the onset of the crisis.

I provide a novel decomposition of the effect on employment growth into firing and hiring. This decomposition shows that firms provide extensive-margin insurance to existing workers against tightened financial constraints—by passing the shocks on to potential new workers. Rather than displacing existing employees, adversely-shocked firms respond by reducing their hiring. Conditional on hiring, I find that shocked younger firms hire differentially fewer college-educated workers. This is consistent with more educated workers being costlier to finance or more reluctant to work for firms in financial distress. To obtain a broader picture of the real effects of entrepreneurial wealth shocks, I employ supplementary capital expenditure data to study the effects on investments. On the extensive margin, I find that adverse wealth shocks significantly lower the probability of positive net investment in plants or property. This effect is significantly higher for younger firms. On the intensive margin, I find that effects are modest for the average firm, but strong for younger firms. A loss of 10% of financial wealth lowers their two-year investment to asset ratio by 4.2 percentage points—a vigorous 84% decline relative to the mean investment rate during 2008 and 2009.

The finding that young firms are the most affected is consistent with Petersen and Rajan (1994) who suggest that firms may follow a pecking-order of borrowing over time with an initial high reliance on funding from the owners. In investigating further heterogeneity, I find that other financial multipliers, such as leverage, do not interact with wealth shocks with similar force. To explore the mechanism behind the the firm-age heterogeneity, I examine the differential ability of young versus old firms to substitute towards other sources of financing. These analyses reveal that older firms are able to substitute towards bank-provided financing, while younger firms see a reduction in bank debt. This firm-age heterogeneity in the degree of substitution between bank and equity financing is consistent with the notion that younger firms face more expensive external financing due to having had less time to develop creditor relationships or a financial track record, and are therefore more vulnerable to financing disruptions. I further find no evidence of shocked

owners in either young or old firms reducing their ownership share. This would occur if adversely affected owners gave way to new investors. This finding is further evidence of material frictions in equity-financing relationships.

Beyond constraining the ability of the entrepreneurs to finance and grow their firms, adverse wealth shocks may also decrease their willingness to do so. Economic theory posits that willingness to take risk depends on wealth (Stiglitz, 1975), thus adversely-shocked entrepreneurs may refuse to allocate more capital to their firms, even if they have the liquidity. Furthermore, recent empirical evidence stresses that investors who experience adverse returns may downgrade their beliefs about the broader economy's prospects and therefore be less willing to take on risk. This offers three plausible channels through which wealth shocks may affect firms. In the ability case, constraints imposed upon the entrepreneur transmit to the firm; in the willingness cases, the entrepreneur chooses to constrain the firm. Which effect dominates may have implications for both economic modeling as well as the correct policy interventions. While it is challenging to decompose these channels, I shed some light on the potential contribution of the willingness channel by studying non-firm portfolio effects. Specifically, I show that adversely-shocked investors do not appear to reduce their risk-taking in their stock market portfolio, in terms of their portfolio variance, risky share, or participation, which indicates that my findings are not driven by an over-all reduced willingness to take risk. I further show that firm financing and employment is only affected by return shocks insofar that they materially affect the entrepreneur's financial wealth, which further suggests that return-driven changes in beliefs is not the primary driver behind my findings.

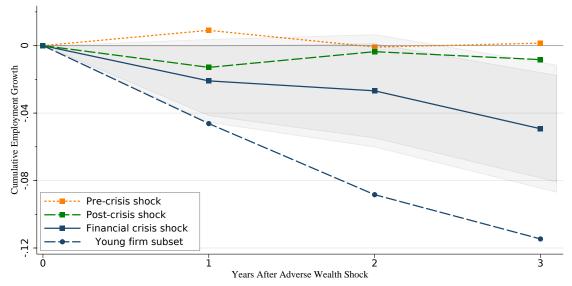
The Financial Crisis of 2008 provides a natural laboratory to study how the procyclicality of entrepreneurial wealth may amplify business cycles. However, it is useful to benchmark the main findings against the adverse effects of owner wealth shocks during non-recessionary periods. I extend my analyses in this direction by exploiting the dispersion in portfolio returns experienced both before (2006–07) and after (2010–11) the crisis, and do not find any statistically significant effects on concurrent employment growth. The effects are contrasted in Figure I. While I cannot rule out effects that are of some economic importance, comparing the effects suggests that wealth shocks largely work to amplify the adverse economic shocks experienced during an economic crisis, such as reduced availability of credit and lower cash flows.

Figure I shows large employment sensitivities for the firms in my analysis sample during the crisis, from about one half for the average firm to above one for younger firms. However, additional analyses reveal that many firms see no employment effects of wealth shocks, including older firms and firms whose owner had little wealth even before the wealth shock. Thus in order to grasp the macroeconomic importance of firms' reliance on owner-provided financing, I perform a simple, partial-equilibrium quantification exercise that extrapolates these heterogeneities to all privately-held firms and weights firms by their employment levels. This reveals a sizable sensitivity: if all

owners lost 10% of their financial wealth, employment in privately-held firms would decrease by 1.2 percentage points.

Figure I: Owner Wealth Shocks and Employment Growth

This figure provides the estimated effect of a stock-portfolio induced 10% financial wealth loss on employment growth. The dotted blue line provides the effect of a shock occurring during 2006–07; the dashed green line during 2010–11; and the solid red line during the financial crisis of 2008–09, with 5% and 10% confidence bands in gray. The dashed red line provides the financial-crisis effect for the subset of firms younger than 10 years as of 2007. Employment growth is relative to the pre-shock employment levels (e.g., 2007 for the financial crisis). See text for description of data and methodology.



This paper faces two broadly-defined sets of identification challenges. First, investors may select into listed stocks that operate in the same or related industries (see, e.g., Døskeland and Hvide 2011; Keloharju et al. 2012). This may cause stock portfolios and private firms to be subject to common shocks. Second, unobservable traits, such as ability or risk aversion, of the investors may lead to correlated outcomes between the listed stocks in their portfolios and the private firms they own. My baseline approach to addressing these issues is to include a rich set of control variables, including industry and geographic fixed effects, controls for past profitability, as well as controls for ex-ante portfolio allocation in terms of its variance and the share of wealth allocated to the stock market. I also introduce placebo tests, demonstrate a lack of pre-trends, and outline treatment heterogeneity that support the notion that the observed effects are causally driven by adverse wealth shocks.

My paper contributes to multiple related literatures. By showing how shocks to business owners' wealth affect firm-level employment, through increasing the severity of financial frictions, I am adding to a growing literature on financial frictions and employment (see, e.g., Bentolila, Jansen, and Jiménez 2018, Berton, Mocetti, Presbitero, and Richiardi 2018, Juelsrud and Wold 2020, Chodorow-Reich 2014, Benmelech, Frydman, and Papanikolaou 2019, Greenstone, Mas, and

Nguyen 2020, Benmelech, Bergman, and Seru 2021, Duygan-Bump, Levkov, and Montoriol-Garriga 2015). This literature presents a near consensus that adverse shocks to bank lending reduce employment growth. However, focusing on smaller firms, Greenstone, Mas, and Nguyen (2020) find statistically insignificant and economically small effects of bank-lending contractions on employment growth, even during the Financial Crisis. They argue that small firms may plausibly have access to other sources of credit when bank lending supply contracts. This would be consistent with the hypothesis that small firms do not face substantial procyclical financing constraints—a hypothesis that I can reject in my empirical setting.

The core contribution of my paper is to focus on a different, highly procyclical, and underresearched source of financial frictions that is particularly important for smaller firms. This contribution is facilitated by merging detailed financial data on both incorporated firms and their
equity holders. I make additional contributions as well: First, I provide a detailed examination
of employment outcomes through (a) distinguishing between the effects on firing and hiring and
(b) considering the effect on the educational composition on workers. This exercise presents new
evidence that it is the pool of potential new employees—rather than the existing ones—who are
affected on the extensive margin. Second, I provide a more complete picture of the real effects
of financing disruptions by also studying the effects on capital investments. Third, I provide evidence of a link between equity- and bank-financing frictions by showing that the ones most affected
by owner wealth shocks (i.e., young firms) are also those who are less able to substitute towards
bank-provided financing.

My results that highlight the importance of business owner wealth for the outcomes of young firms contributes to a large literature on financial frictions and entrepreneurship (see, e.g., Hvide and Møen 2010, Fracassi, Garmaise, Kogan, and Natividad 2016, Cespedes, Huang, and Parra 2019, Andersen and Nielsen 2012, Adelino, Schoar, and Severino 2015, Schmalz, Sraer, and Thesmar 2017, Hurst and Lusardi 2004, Kerr, Kerr, and Nanda 2015, Corradin and Popov 2015) that has largely focused on entrepreneurial entry rather than the effects of shocks to existing firms. While there is growing evidence that local house price appreciation facilitates business growth, there is still no consensus regarding the extent to which personal wealth facilitates entrepreneurship through alleviating financial frictions (see, e.g., Hurst and Lusardi 2004, Andersen and Nielsen 2012, and Kerr, Kerr, and Nanda 2015). In the broader entrepreneurship literature, this paper complements research on angel financing (Lindsey and Stein 2019, Kerr, Lerner, and Schoar 2014, Denes, Howell, Mezzanotti, Wang, and Xu 2020) by highlighting the importance of the financial circumstances of investors on firm outcomes.³ It is also consistent with the findings of Townsend (2015) that financial

³See also the concurrent paper by Berzins, Bøhren, and Stacescu (2020) who study the effect of wealth-tax-induced shareholder illiquidity on firm outcomes; Bahaj, Foulis, and Pinter (2020) who document important (collateral) effects of directors' home values on firms' financing and investment outcomes; Bjørneby, Markussen, and Røed

shocks may propagate through common ownership and the findings of Hanspal (2018) that the loss of wealth for sole-proprietors may inhibit business growth. My analyses of age-heterogeneity in the responses to economic shocks contribute to recent studies of differential effects of economic shocks on firm employment (see, e.g., Adelino, Ma, and Robinson 2017, Brown, Earle, and Morgulis 2015). By showing that firms largely insure existing workers against financial shocks on the extensive margin, I contribute to the literature on the pass through of firm shocks to workers (see, e.g., Guiso, Pistaferri, and Schivardi 2005, Ellul, Pagano, and Schivardi 2018, Friedrich, Laun, Meghir, and Pistaferri 2019, and Sockin and Sockin 2021). This paper also contributes to a new literature establishing a causal link from stock market fluctuations to the real economy (Di Maggio, Kermani, and Majlesi 2020, Chodorow-Reich, Nenov, and Simsek 2019, Crane, Koch, and Lin 2019).

The paper proceeds as follows: Section I describes the data and empirical strategy. Section II considers owner-provided financing results. Section III considers the real effects of owner wealth shocks. Section IV discusses the mechanisms behind my findings and Section V concludes.

I Data and Empirical Strategy

A Data Sources

This paper uses Norwegian administrative data maintained by Statistics Norway. Data collection primarily occurs through third-party reporting, where government agencies, financial institutions, and employers report data directly to the tax authorities. The different data sources are linked by using (de-identified) person and firm identification numbers that are consistent across datasets.⁵ It covers the universe of Norwegian residents and incorporated domestic firms.

A particularly attractive feature of this data is that it offers the ability to link households and incorporated firms through the *Stockholder Register*. This register, which is unique in an international setting, was established in 2004 to streamline the reporting of private equity wealth for wealth tax purposes. It allows me to focus on *incorporated* entrepreneurs. These are the type of entrepreneurs who Levine and Rubinstein (2017) find to "engage in activities and open businesses that are more closely aligned with core conceptions of entrepreneurship"—a point also made by Berglann et al. (2011) using Norwegian data. The presence of limited liability for incorporated firms implies that the entrepreneurs and their firms firm have (legally) distinct balance sheets.

⁽²⁰²⁰⁾ who find a positive effect of wealth taxes on firm employment growth; Becker and Hvide 2019 who find large detrimental effects of the entrepreneur's departure through death; and Fonseca and Wang 2021 who study the substitution between business and personal credit.

⁴Hanspal (2018) makes a similar concurrent contribution by using stock holdings in failing banks as one of his main explanatory variables.

⁵I provide more detail on the merging process and the construction of the final analysis dataset in Internet Appendix C.

This allows me to study financing outcomes and effects on ownership structure. It is also a requirement for studying employment effects, as unincorporated Norwegian sole proprietors rarely have employees.⁶

Income Register (1993 to 2012): These records contain detailed information about individuals' income, broken down into various sources such as wage income, capital income and government transfers. For the purpose of annual wealth taxation, the data includes information on individuals' wealth, broken down into different asset classes, such as bonds, mutual funds, listed stocks, non-listed stocks, primary and secondary real estate, debt, and deposits.

Stockholder Register (2004 to 2013): This database contains yearly snapshots of ownership positions in all listed and non-listed limited liability companies. It contains security (share type and firm) and owner (firm or person) identifiers, and provides the number of shares held at the end of the year and the amount of dividends that were paid to the stockholder.

Employer-Employee Register (1995 to 2011): This register contains data on each employment relationship between individuals and firms. A record in this dataset is on the firm-plant-employee-year level. For each record, I observe firm, plant, and employee identifiers, the start and stop dates of the employment relationship, and total monetary compensation.

Firm Tax Returns (2004 to 2013): These records contain detailed data on firms' income and assets in the form of approximately 400 accounting variables. It contains similar variables as those found in common datasets such as BvD Amadeus, but contains a large set of additional variables collected for tax purposes. This database covers the universe of incorporated firms.

Supplementary data includes: Records of family links, addresses, gender and marital status from the *Central Population Register* (1993 to 2010); Educational attainment for all residents from the *National Education Database* (1993 to 2012).

The data sources introduced above offer a unique opportunity to study the interplay between financial markets and the real economy. Reassuringly, the Norwegian business environment is comparable to most other developed countries, suggesting that unique features of the empirical setting are unlikely to drive any of the results (see fuller discussion in Internet Appendix B.)

Filters used to obtain final dataset. I only keep matched firm-investor pairs that satisfy the following criteria in 2007: (1) Firm profitability (profits/revenue) must be between -75% and 75%; (2) the investor must own at least 1% of the firm; and (3) the firm must employ at least 1 non-owner. This leaves me with 67,000 firm-investor level observations in 2007, and approximately 32,000 firms employing around 300,000 non-owner employees. For my analyses, I focus on the subset of firm-investor observations where I observe that the investor owns listed stocks. This reduces my

⁶As of 2008, there were 146,903 sole proprietorships (enkeltpersonforetak) in Norway. Only 15% of these had any employees, and only 2% had more than four employees. Source: Statistics Norway (statistics series 09107)

sample to 20,000 firm-investor observations. This reduction is due to the fact that many investors primarily hold mutual funds, for which I do not observe the exact portfolio composition—and I am therefore unable to exploit cross-sectional variation in returns across funds. I make the additional restriction that the owner must have at least 1% of his or her Gross Financial Wealth (GFW) in listed stocks. These owner-firm pairs do not provide much identifying variation in terms of relative wealth shocks. Relatedly, I also require that the stock market holdings make up at least 1% of the average of the past 2 years' operating expenditures (proxying for potential financing needs) of the firm he or she owns. This reduces the number of observations at the firm-owner level in 2007 to approximately 4,700.

A.1 Defining the Main Variables

Gross Financial Wealth (GFW). This is the sum of domestically held financial assets: deposits, bonds, mutual fund holdings, listed stocks, taxable value of private equity holdings, and outstanding claims. Deposits, bonds, mutual funds, and listed stocks are third-party reported (e.g., banks or other financial intermediaries) and are marked to market. Private equity holdings are provided in the firm's tax returns to the tax authorities and is then pre-filled onto investors' tax returns. It is roughly computed as the owner's ownership share * (historical cost of firm assets + market value of financial assets - firm debt).

Stock Market Exposure. This is the fraction of the owner's Gross Financial Wealth that is invested in listed domestic stocks.⁷

$$\frac{Stocks_{v,t}}{GFW_{v,t}} \tag{1}$$

Returns. For brevity, I will refer to "intended returns" as just returns. (Intended) returns are the returns that an investor, v, would experience from time t to t + j, assuming that the portfolio composition does not change after time t, that is, the weight, $w_{v,s,t}$, of investor, v's, holdings of stock, s, does not change between time t and t + j. In Internet Appendix K, I present evidence consistent with a strong relationship between intended and experienced returns.

$$R_{v,t,t+j} = \sum_{s} R_{v,s,t,t+j} \cdot w_{v,s,t} \tag{2}$$

Stock Market Wealth Shock. My main explanatory variable is the product of the owner's intended returns (equation 2) and the owner's stock market exposure (equation 1). This product gives us the fraction of the owner's wealth that he or she is "intended" to lose.⁸

$$\frac{Gains_{v,t+1-t+2}}{GFW_{v,t}} = R_{v,t,t+2} \cdot \frac{Stocks_{v,t}}{GFW_{v,t}}$$
(3)

⁷This does not include foreign-held stocks, for example directly-held stocks on a foreign stock exchange. (Directly) owning foreign stocks is uncommon. Ring (2020) shows that for moderately wealthy Norwegians, the foreign-held component of GFW is 0.8% at the mean (see Appendix Table A.1 in Ring (2020)).

⁸Since I do not observe within-year transactions, I cannot use this as an instrument in a traditional IV setting. If,

This empirical design only uses variation coming from ownership in listed stocks. While mutual fund ownership is extensive, I do not observe the ownership composition in terms of funds or underlying securities. I only observe the yearly amount held in mutual funds, which precludes me me from using ex-ante portfolio composition as an instrument.

B Summary Statistics

I report some key summary statistics on firm characteristics in Panel A of Table I. The average firm in my sample has 3 MNOK in assets (USD 500,000) in assets, 9 and employs 8.54 individuals, out of which 6.96 are regular employees and not owners in the firm. This dataset is thus well suited to analyze the behavior of smaller firms who account for a sizable fraction of employment in most countries. 10

I also explore how firms whose owners own listed stocks differ from other firms (see Internet Appendix Table III). I find that they are generally somewhat older (13.8 versus 12.4 years), have higher profitability (10% versus 7%), and are less levered (50% versus 56%). The differences are not dramatic, but suggest that the firms that are in my sample were somewhat less financially constrained *prior to* the financial crisis. It would therefore be likely that the elasticities that I uncover would understate those found in a broader sample of firms, which would include firms that were more constrained ex-ante.

I compare the industry composition of the firms in my analysis sample with a broader sample of Norwegian firms in Internet Appendix Figure I. The main sample restriction is that the firm must have one or more owners who own listed stocks. The largest industry group in my sample is professional services. This group consists mostly of accounting firms (30%), engineering consulting services (25%), and auditing firms (10%). Due to the sizable overrepresentation (by about 100%) of professional services (PS) in my analysis sample, caused by restricting the sample to owners with a meaningful listed stock portfolio, I (down-)weight these firms by a factor of 0.5 in my analyses on employment and investment effects. This re-weighting, however, does not matter: My main results on employment are highly robust to different weighting schemes, which include not (down-)weighting PS firms as well as completely omitting them. The results of these robustness tests are reported in Internet Appendix Table XVII.

for example, I use this as an instrument for log-differenced GFW, the first stage could be (endogenously) biased downward if entrepreneurs reduce their consumption to offset losses. However, I discuss how one might want to scale the reduced-form estimates in Internet Appendix K.

⁹This is the exponentiated mean of log assets, and thereby down-weights high-asset outliers.

¹⁰In 2017, 28% of U.S. private sector employees worked at firms employing less than 50 people. In Norway this fraction is closer to 50%.

Table I: Summary Statistics

	N	mean	sd	p10	p25	p50	p75	p90
	Ра	NEL A: F	IRM CHAF	RACTERIST	ΓICS			
$\log(Assets)$	4051	14.89	1.14	13.54	14.12	14.84	15.57	16.38
Firm Age	4051	13.77	11.56	2.00	6.00	11.00	19.00	26.00
Paid Dividends	4051	0.29						
Leverage (LT)	4026	0.09	0.17	0.00	0.00	0.00	0.10	0.34
Leverage (ST)	4026	0.41	0.21	0.15	0.25	0.39	0.54	0.70
Profitability	4026	0.10	0.15	-0.02	0.02	0.08	0.17	0.28
Cash/OpEx	4026	0.24	0.26	0.02	0.06	0.15	0.31	0.61
# Owners	4026	2.76	1.81	1.00	1.00	2.00	4.00	5.00
Employee Characteristics								
# Owner-employees	4051	1.58	1.30	0.00	1.00	1.00	2.00	3.00
# Reg. employees	4051	6.96	11.99	1.00	1.00	3.00	7.00	15.00
	Panel	B: Owne	er-Pair C	CHARACTE	ERISTICS			
Ownership (Share)	4783	0.55	0.34	0.10	0.25	0.50	1.00	1.00
Employed	4783	0.60						
Employment Tenure (Years)	2669	11.75	8.47	2.00	5.00	10.00	18.00	24.00
GFW/OpEx	4783	0.75	0.77	0.08	0.18	0.44	1.05	2.45
Stocks/GFW	4783	0.20	0.22	0.02	0.05	0.11	0.27	0.53
$Gains_{08-09}/GFW$	4783	-0.06	0.11	-0.16	-0.07	-0.02	-0.01	-0.00

All variables are measured in December 2007. LT refers to long-term, and ST refers to short-term. Cash/OpEx is the sum of bank deposits and cash divided by the average of the firm's past two years operating expenditures. # Owners counts the number of owners in the firm, including owners that are not in my analysis sample. Additional summary statistics related to firm employment are provided in Internet Appendix Table VI. In Panel B, the unit of observation is the firm-investor level, and each observation is weighted by the owner's stock market exposure such that the weights sum to 1 for each firm.

Panel B of Table I provides summary statistics on the firm-owner level. On the firm-owner level, the mean ownership share, which includes spousal co-ownership, is 55%. I find that most owners were also present in previous years: Conditional on the firm existing in 2004, 92% of owners were present also in 2004. I find that 16% (11%) of owners have increased (decreased) the number of shares they own since 2004. I observe that 71% of owners live in the same city as their firm and 85% live in the same county. There is also a large presence of family businesses. Conditional on not being a sole-owner, 21% of investors co-own with a sibling and 17% are parents of other owners. These and related statistics are reported in Internet Appendix Table II. A majority of

owners are also employed in the firm. On average, they have worked in the firm for 11.71 years, and their labor earnings from the firm make up 96% of their total labor earnings, implying that very few owner-employees are also employed elsewhere. 30% of the firms pay dividends, and on average (including those who do not pay dividends) these dividends are equal to 5% of the investors' GFW in 2007, and the sum of dividends in 2008 and 2009 made up, on average, 17% of their 2007 GFW, implying that the ratio of dividends to financial wealth rose during the financial crisis. I explore owner characteristics in more detail in Internet Appendix Table I: The median owner has MNOK $4.6 (\approx \text{USD } 770,000)$ in GFW and on average owns 1.26 private firms.

B.1 Owners' Stock Portfolios

Figure II: STOCK PORTFOLIO RETURNS

This figure provides histograms of the 1-year (2008) and 2-year (2008 and 2009) returns for the stock portfolios of the business owners in the sample. These returns are calculated by applying realized returns to 2007 end-of-year portfolio weights; following the definition in equation 2, using t=2007 and j=1,2. Returns above the 99th percentile are omitted for the purposes of this illustration.

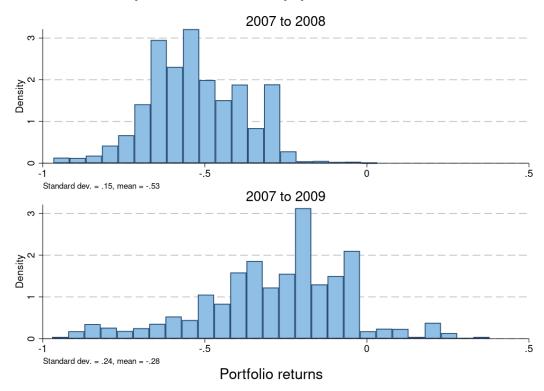


Figure II keeps portfolios fixed at the (end-of-year) 2007 composition and provides the distribution of owners' stock returns during 2008 and the two-year period covering 2008 and 2009. I see that nearly all investors experienced negative returns during 2008, and that there is only moderate dispersion in returns (sd=15%). During the two-year period of 2008 and 2009, on the other hand, there is a much larger dispersion (sd=25%)—with almost 5% of investors experiencing positive

returns, and 5% of investors experiencing returns south of -74%.

Beyond providing more cross-sectional variation in wealth shocks, using two-year returns addresses the issue that one-year returns provide highly transitory wealth shocks: The correlation between 2008 and 2009 portfolio returns is approximately -1, which is driven by a similar autocorrelation in the underlying stocks on the Oslo Stock Exchange. Thus, the portfolios that performed the worst during 2008 performed fairly well during 2009, making wealth shocks based on 2008 returns alone very short lived. While the effects of transitory shocks are interesting, as they can inform us of potential long-lived effects of only temporarily worsened financial conditions, the limited variation in 1-year returns lower our ability to perform statistical inference. This is clear from supplementary analyses provided in Internet Appendix Figure VI, which exhibits confidence intervals of the effects on wealth shocks on employment growth that are twice as large as when using 2-year returns.

C Empirical Specification

My main regression specification to estimate the effect of owner wealth shocks on firm outcomes, $Y_{f,v}$, is the following:

$$Y_{f,v,t} = \alpha_{r,t} + \alpha_{n,t} + \beta_t \frac{Gains_{v,08,09}}{GFW_{v,07}} + \Gamma_t \left(\frac{Stocks_{v,07}}{GFW_{v,07}} \right) + \rho_t' P_{v,07} + \eta_t' V_{v,07} + \zeta_t' F_{f,07} + \varepsilon_{f,v,t}, \quad (4)$$

where the v subscript indicates the owner/investor and the f subscript indicates the firm. Outcome variables, Y, are primarily measured at the firm level, but some outcomes, such as dividend flows, are measured at the firm-owner (f,v) level. Equation 4 is estimated separately for different t whenever event-plots are provided. I typically measure firm-level outcomes as (cumulative) growth rates relative to 2007, which removes firm-level fixed effects in the level of the variable of interest. ¹¹ $\alpha_{r,t}$ and $\alpha_{n,t}$ are region and industry fixed effects, respectively. I primarily use 3-digit NACE codes, but show that the main results are unchanged when using 3- or 4-digit codes. Regions are the 19 Norwegian counties. The main coefficient of interest is β , which measures the effect of wealth shocks on $Y_{f,v}$. The shock variable $Gains_{v,08,09}/GFW_{v,07}$ is the fraction of the owner's financial wealth to be gained (or mostly lost) in the stock market during 2008 and 2009 when the portfolio composition is kept constant at its 2007 configuration.

My main control variable is the fraction of wealth invested in the stock market per December 31st 2007, $Stocks_{v,07}/GFW_{v,07}$, and its square: $\Gamma_t(x) = \gamma_{1,t}x + \gamma_{2,t}x^2$. These terms are intended to flexibly account for the fact that more exposed owners may have firms with different economic trajectories. For example, owners may optimally choose to allocate more of their assets to the stock market, rather than to their own firm, when their firm's growth opportunities are limited.

¹¹This is the approach in Chodorow-Reich (2014) as well as similar to Benmelech, Frydman, and Papanikolaou (2019) who center event time to one year before the Great Depression.

In order to increase precision and further limit the set of potential confounding factors, I include a number of control variables valued as of 2007. P is a vector of portfolio controls, including the portfolio HHI and the average log stock market capitalization of the firms in the portfolio. In P, I also include another measure of ex-ante risk-taking, namely the stock portfolio variance as of 2007. This is calculated using 36 months of returns for the stocks in the portfolio as of Dec 31st 2007. I also include $Portfolio\ Variance$ interacted with $Stocks_{v,07}/GFW_{v,07}$ as an additional control. Finally, P includes a variable indicating the fraction of listed stocks held through a holding company (a separate LLC). I perform robustness tests where I also condition on past returns by including 1st through 4th order polynomials in demeaned portfolio returns between 2005 and 2007.

V is a vector of business owner characteristics, including age bins (20-35; 36-45; 46-55; 55-67; 67+), $\log(GFW)$, $\log(debt)$, $\log(labor\ earnings)$, dummies for educational attainment (compulsory, high-school, and college), and the share of financial wealth invested in mutual funds.

F is a vector of firm controls including long-term (LT) and short-term (ST) leverage, $\log(assets)$, $\log(OpEx)$, $\log(total\ payroll)$, Profitability (profits/revenue), and liquidity, as measured by Cash/OpEx, which is the sum of cash and bank deposits divided by the firm's average operating expenditures over the past two years. In specifications including both F and V controls, I also include the relative size of the investor, as measured by the ratio of the owner's GFW to the firm's OpEx, a dummy for receiving a dividend, and the dividend amount scaled by GFW.

In my regressions on firm-level outcomes, I apply weights to ensure that firms are equally weighted in the presence of multiple investors. While the average firm has 2.75 owners, most of these owners will not appear in the regression at the same time, because I only include owners with a stock market exposure (Stocks/GFW) exceeding 0.01. Only a handful of firms have multiple business-owners satisfying this requirement, and for those firms I weight the investors according to the size of their stock market portfolio. In robustness checks, I show that my main results are virtually unchanged when instead weighting by ownership share or applying equal weights for all observations.

D Discussion of Internal Validity

The strength of the identification in this paper is that—conditional on portfolio selection—the exact returns that the entrepreneur's portfolio will experience is fully exogenous to the entrepreneur. This overcomes the issue that changes to the entrepreneur's wealth may be correlated with—or endogenous to—their investment opportunities. For example, entrepreneurs may save more to offset lower expected cash-flows in the future, or strategically save in assets whose returns are affected by the firm's actions (Decaire and Sosyura, 2020). They may also save more if their expected return on capital goes down, and income effects dominate intertemporal substitution effects as in Ring

(2020).

Since individual returns are exogenous, but portfolio stocks are selected, the key question for assessing the validity of the empirical design is thus the following. To which extent did entrepreneurs, prior to the crisis, select stocks whose subsequent returns were correlated with other factors affecting firm performance during the crisis? Recent research shows that investors have a bias towards investing in firms that are close in both a geographic and industry sense (Døskeland and Hvide, 2011), which may lead to common shocks affecting my findings. I address this by including industry and geographic fixed effects, and I show that using increasingly granular industry classifications do not affect my findings.¹² I also find that returns are uncorrelated with changes in firm revenue or profitability when the effect on financial wealth is modest due to a low over-all exposure (see Internet Appendix I). These are the cases in which selection effects may produce non-causal correlations, but wealth shocks would be too modest to constrain the entrepreneur.

Beyond common shocks, there is a concern that investor characteristics correlate with both experienced returns and firm outcomes. This motivates the inclusion of the wide range of investor, portfolio, and firm controls as described in the previous section. However unobservable traits may lead some investors to, for example, select more procyclical listed stocks and private firms. Reassuringly, my findings of no pre-trends in firm financing or employment outcomes are inconsistent with this. Internet Appendix Table X also reveals no statistically significant correlation between educational attainment, portfolio diversification, or firm profitability with future stock returns. This results still hold when I condition on the owner having been present in the firm for multiple years, thus giving unobservable traits such as investment skill time to materialize as higher profitability for the firm. My main employment results are also robust to controlling for both past and (possibly-endogenous) future profitability. Finally, the heterogeneity of my results does not seem consistent with these confounders driving my results.

D.1 Differences on Observables: Wealth Shocks and Pre-period Observables

I investigate whether adversely shocked firms are different on observable characteristics by regressing firm characteristics on the wealth shock and stock market wealth exposure variables as well as industry and region fixed effects. Taking out these fixed effects allow us to interpret the coefficients as indicators of how these firms differ from other firms in the same region or area. It also allows us to partially test the main identifying assumption that wealth shocks, once I condition on overall exposure as well as industry and region fixed effects, are uncorrelated with other confounding factors that may affect employment growth.

¹²I also explore how portfolio returns covary with industry characteristics in Internet Appendix Figure V. This reveals no material (unconditional) correlation between the forward returns of the 2007 portfolio and characteristics such as industry concentration, average crisis-period employment growth, or pre-crisis profitability.

Table II: WEALTH SHOCKS AND LAGGED OBSERVABLES

	(1) Profitability	$(2) \log(Assets)$	(3) Leverage	$\begin{array}{c} (4) \\ {\rm Cash/OpEx} \end{array}$	(5) log(Firm Age)	(6) Frac. College
$Gains_{08-09}/GFW_{07}$	-0.032	-0.339	-0.049	0.016	0.121	0.044
	(0.024)	(0.218)	(0.049)	(0.041)	(0.157)	(0.060)
$ m Stocks_{07}/GFW_{07}$	-0.143***	-0.850***	0.351***	-0.418***	-0.455**	0.042
	(0.031)	(0.261)	(0.053)	(0.050)	(0.181)	(0.060)
$(Stocks_{07}/GFW_{07})^2$	0.090**	0.595**	-0.240***	0.304***	0.310	-0.006
	(0.036)	(0.300)	(0.061)	(0.057)	(0.212)	(0.070)
$E[\Delta Y \mid \Delta Stocks/GFW = 1 \text{ sdev}]$	02	107	.044	051	059	.008
mean(Y)	.096	14.927	.498	.228	2.424	.195
sdev(Y)	.146	1.15	.234	.252	.777	.304
FE	NACE3,R	$_{ m NACE3,R}$	$_{ m NACE3,R}$	$_{ m NACE3,R}$	NACE3,R	NACE3,R
R2	0.154	0.200	0.124	0.192	0.114	0.272
N	4750	4750	4750	4750	4750	4750

Standard errors are two-way clustered at the firm and investor level and are reported in parentheses. *, **, and *** indicate significance at the 10%, 5%, and 1% levels, respectively. $Gains_{08-09}/GFW_{07}$ is amount of stock market gains the investor experienced during 2008 and 2009, fixing portfolio weights in 2007, scaled by 2007 GFW. The difference in Y based on changing Stocks/GFW by one standard deviation evaluates Stocks/GFW at the mean. Frac. College refers to the fraction of employees with a college degree. Dependent variables are measured as of end-of-year 2007. See Internet Appendix Table XVIII for results using a specification that includes portfolio variance as an explanatory variable.

Reassuringly, I find that my shock variable is not predictive of pre-shock observable characteristics of the firm. However, I do find, perhaps unsurprisingly, that firms whose investors had allocated a larger share of their financial wealth to the stock market (Stocks/GFW) are different. I find that these differences are best characterized by a second-order polynomial in Stocks/GFW. To ease readability, I provide the predicted differences in my Y-variables based on increasing Stocks/GFW by one standard deviation (0.22) from the mean (0.20). On the intensive margin, firms with more exposed owners (one standard deviation from the mean) are less profitable (2 percentage points or 21%), smaller (0.11 log points), more levered (4.4 percentage points, or 10%), less liquid (5.1 percentage points or 22%), and slightly younger (0.06 log points). On the extensive margin, differences go in the opposite direction. This can be seen in Internet Appendix Table III. Here, I also show that more exposed firms had higher past employment growth than less exposed firms, but in the fourth quartile of exposure past employment growth is identical as to the over-all population of firms. Conclusions are similar for leverage and profitability.

II Results on Owner-provided Financing

I now examine whether and how wealth shocks affect the owner-provided financing of firms. This tests the hypothesis that firms with adversely-shocked owners can substitute towards other equity investors. Thus, an idiosyncratic shock to the wealth of an existing owner should not affect, for example, the probability of the firm receiving an equity injection. Relatedly, we would also not expect to find an effect on dividend payments, as owners could forego these by, for example, selling an equity stake in the firm to salvage personal liquidity.

Testing this hypothesis is particularly informative in my empirical setting where I obtain identifying variation in wealth from households' *idiosyncratic* exposure to exogenous variation in stock returns during 2008 and 2009. That the shocks are idiosyncratic is important—because a shocked entrepreneur could, in theory, approach unshocked local investors for financing. This would not be the case if I had used local or regional shocks, such as house price shocks, which is the dominating supplier of identifying variation in the entrepreneurial finance literature (see, e.g., Schmalz, Sraer, and Thesmar 2017, Adelino, Schoar, and Severino 2015, Kerr, Kerr, and Nanda 2015, Corradin and Popov 2015), since alternative local providers of equity-financing, for example, angel investors or other firms, may have a reduced investment ability through the collateral channel (Chaney, Sraer, and Thesmar, 2012).

I report the results on the related analyses in Table III. I focus on three outcome variables and restrict the sample to firms that do not have listed stocks on their balance sheets. Columns (1)-(2) consider the effects on Paid-in-Capital (PIC). The outcome variable is a dummy variable for whether the firm saw an increase in PIC (i.e., an equity injection) during 2008 and 2009. In column (1), I find that a moderate financial wealth loss of 10% reduces the probability of an equity injection by 1.37 percentage points. This is a fairly large effect of 22% when we scale by the unconditional probability of an injection (6.1%). This variable is measured at the firm level. This implies that if there are no frictions to raising equity from other (unshocked) investors, and the firm's liquidity needs are unaffected, we should not see any effect. This finding is thus indicative of stickiness in equity-financing relationships. This line of reasoning is employed in the literature on the transmission of bank shocks: If an adverse shock to a bank with which the bank has a relationship translates into reduced borrowing, then this implies frictions in bank-lending relationships (see, e.g., Chodorow-Reich 2014).

¹³In this section, the sample is limited to firms that do not own any listed stocks. For tax smoothing reasons, business owners may choose to invest in the stock market and attribute the ownership of these stocks to the firm. Thus, from a tax accounting perspective, the financial shock would appear within the firm, without any effect on the flow of financing from the owner's outside wealth and the firm. Approximately 14% of firms in my sample are recorded as owning listed stocks.

¹⁴Since many firms are close to the regulatory minimum PIC of NOK 100 000, there are very few instances where PIC decreases. The unconditional probability of a PIC increase is 6.1%, there is therefore little room to statistically uncover intensive-margin effects.

Table III: THE EFFECT OF WEALTH SHOCKS ON FIRM FINANCING: EQUITY-INJECTIONS, DIVIDEND FLOWS AND OWNER-PROVIDED LOANS

	Financing Outcomes During 2008–09								
	Δ Paid-in-0	Capital > 0	Dividen	ds/GFW	ΔInvestor I	Loans/GFW			
	(1)	(2)	(3)	(4)	(5)	(6)			
$Gains_{08-09}/GFW_{07}$	0.143** (0.071)	0.109* (0.058)	-0.082 (0.097)	-0.129 (0.103)	-0.050 (0.110)	-0.046 (0.097)			
$\rm Gains_{08-09}/\rm GFW_{07}$ * Leverage		0.143* (0.074)		-0.148* (0.084)		-0.344*** (0.127)			
$\rm Gains_{08-09}/\rm GFW_{07} * Cash/OpEx$		0.021 (0.073)		-0.311** (0.138)		-0.331** (0.129)			
$\rm Gains_{08-09}/\rm GFW_{07}$ * Profitability		-0.140 (0.090)		-0.042 (0.135)		0.168 (0.145)			
mean(Y)	.061	.061	.148	.148	001	001			
P, F, and V controls	Y	Y	Y	Y	Y	Y			
FE	$_{ m NACE3,R}$	NACE3,R	$_{ m NACE3,R}$	NACE $3,R$	NACE3,R	NACE3,R			
R2	0.1309	0.1383	0.4611	0.4767	0.1989	0.2093			
N	3722	3722	3408	3408	3722	3722			

Standard errors are two-way clustered at the firm and investor level and are reported in parentheses. *, **, and *** indicate significance at the 10%, 5%, and 1% levels, respectively. $Gains_{08-09}/GFW_{07}$ is amount of stock market gains the investor experienced during 2008 and 2009, fixing portfolio weights in 2007, scaled by 2007 GFW. Interaction variables are normalized to have a zero mean and a standard deviation of one, and are included as controls, as well as interactions with Stocks/GFW. Controls include $Dividends_{07}/GFW_{07}$, a $Dividends_{07} > 0$ dummy, an $InvestorLoans_{07} > 0$ dummy, $InvestorLoans_{07}/GFW_{07}$. $\Delta Paid-in-Capital > 0$ is equal to one if $PIC_{09} > PIC_{07}$. Dividends refer to dividends paid during 08 and 09. $\Delta InvestorLoans = InvestorLoans_{09}-InvestorLoans_{07}$. Paid - in - Capital and Investor loans are measured at the firm level (from firms' tax returns), while dividends are on the firm-investor level (from the Stockholder Register). Interaction variables (Leverage, Cash/OpEx, Profitability) are measured as of 2007.

In column (2), I show that the effect on PIC is stronger for more levered firms. This is consistent with more levered firms having a higher demand for equity-financing during the crisis. In columns (3)-(4), I report results on how wealth shocks affect dividend payments at the firm-investor level. I scale dividend payments by the owner's GFW, which facilitates a NOK-for-NOK interpretation. While wealth shocks do not affect dividend payments on average, there is sizable heterogeneity along the dimensions of leverage and liquidity. A wealth loss of NOK 1 increases dividend payments by NOK NOK 0.325 (0.156) for firms whose liquidity (leverage) is one standard deviation above the mean. The interaction with liquidity is intuitive: More liquid firms have a higher ability to pay dividends to offset the adverse effects on the personal financial situation of the owner.

The intuition behind the leverage heterogeneity is best captured with the following reading of the interaction coefficient on leverage in column (2). Owners who lose less in the stock market

receive less dividends whenever the firm's leverage is larger. This is consistent with the hypothesis that firms with more leverage have a stronger need to retain equity, and that investors who lost less are more able to allow for equity retention through foregoing dividends. That the coefficient on the leverage interaction is negative when considering dividend payments (negative equity injection) is consistent with the positive coefficient on the interaction when considering increases in PIC (positive equity injection).

Columns (5-6) consider the effects on owner-provided investor loans. This type of owner-provided financing is similar to equity in that it has very low seniority, but may be a preferable method of liquidity injection since it does not require changing the ownership structure of the firm. The dependent variable that I examine is the change in investor loans on the firm's balance sheet from 2007 to 2009, scaled by the owner's GFW, which also facilitates a NOK-for-NOK interpretation. While I find no effects on average (column 5), this masks significant heterogeneity with respect to liquidity and leverage in column (6). A wealth loss of NOK 1 is associated with a 0.33 NOK decrease in investor loans for a firm with Cash/OpEx one standard deviation below the mean. In other words, the provision of investor loans is more sensitive to the owner's wealth whenever the firm's liquidity is low. This is rather intuitive, as more liquid firms may have less of a need for owner-provided debt financing.

Column (6) further shows a negative coefficient on the interaction between wealth shocks and leverage. This can be read as less negatively shocked owners providing less investor loans whenever the firm is more levered. This can be rationalized by liquidity-rich owners wishing to provide equity rather than debt financing to their firms. This idea is consistent with the findings in column (2), which provides an oppositely-signed coefficient on the shock and leverage interaction when considering equity financing as the outcome variable. This may be caused by a preference for lower observable leverage among distressed firms. In Norway, and most other European countries, private firm accounting data is publicly available. Increasing leverage might thus send an observable, and potentially negative, signal about firm bankruptcy risk to suppliers and customers.

In the previous paragraphs, I interpret the leverage heterogeneities in columns (2), (4), and (6) as evidence of a preference for equity rather than debt, and that increasing the equity to debt ratio can only be achieved by less-shocked owners. An alternative view is that shocked owners are attempting to reduce the riskiness of their invested capital by substituting their equity stakes for debt claims on the firm, and that this strategy is more attractive when leverage is already high. However, it is unclear exactly how much this would reduce the owners' risk, as owner-provided loans (columns 5 and 6) are still junior to most other debt claims, such as bank debt.

To examine the presence of pre-trends in financing outcomes, I repeat my analysis while considering outcome variables during 2005–06 (and keeping all the right-hand-side variables the same).

Reassuringly, this does not reveal any statistically significant correlations (see Internet Appendix Table VIII).

Finally, adverse effects on firm financing can occur for reasons unrelated to the owner's ability to provide liquidity. For example, to the extent that adversely-shocked owners downgrade their beliefs or willingness to take risks, they may wish to limit their over-all risk exposure by defunding the firms. However, in section C I show that there is no evidence that shocked owners reduce their risk-taking outside the firm, accumulate more safe assets, or abstain from financing their firm when there is only experienced returns are low but the wealth shock is small. This suggests the main mechanism behind the findings in Table III is reduced liquidity.

III Results on Employment Growth

A Definition of Employment Growth

My sample primarily consists of businesses with fewer than 20 employees. Since many employees are also owners, I omit them when measuring differences in employment levels. This addresses the concern that the employment situation of owners may be affected through other channels, such as the owner responding to adverse wealth shocks by increasing labor supply.¹⁵

My main measure of employment growth is defined as follows:

$$EG_{f,t,t+j}^{D} \equiv \frac{\text{\#Non-owner Employment Days}_{f,t} - \text{\#Non-owner Employment Days}_{f,t}}{\text{\#Employment Days}_{f,t}}, \quad (5)$$

where firms that exit at time t are defined to have zero employment days at time t. This measure is based on days of employment rather than number of employees, which addresses potentially important measurement issues related to seasonality and turnover. I further use the standard formula for growth (bound to be $\leq 200\%$) rather than a symmetric growth rate or log-differences as these specifications may exaggerate employment decline in the presence of small firms. I discuss these issues and provide robustness checks in Internet Appendix N.

B When Do Wealth Shocks Matter for Firm Employment?

If an owner of a firm has little wealth relative to the potential financing needs of the firm ex-ante, any shocks to his or her wealth is unlikely to have impact on the financing available to the firm, ex-post. Similarly, if the owner has substantial wealth relative to the firm, any shocks to the ability, or perhaps willingness, to provide financing may not be large enough to affect the flow of funds to the firm. Thus, I only expect meaningful effects when the owner's status as a viable financier changes. This is exactly what I uncover: I create bins for different ratios of owner financial

¹⁵These effects have been found to be strong in many settings. See, e.g., Bø, Halvorsen, and Thoresen (2019), Ring (2020), Zator (2020), and Hanspal, Weber, and Wohlfart (2020).

wealth to firm operating expenditures, and estimate the effect on wealth shocks, as a fraction of the owner's financial wealth, separately within these bins (denoted g). These results are reported in Figure III below, which are based on estimating equation 6 below.

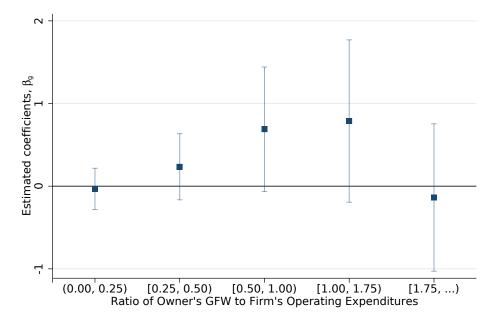
$$\frac{E_{f,2010} - E_{f,2007}}{E_{f,2007}} = \alpha_n + \alpha_r + \alpha_g + \beta_g \frac{Gains_{v,08,09}}{GFW_{v,07}} + \Gamma_t \left(\frac{Stocks_{v,07}}{GFW_{v,07}} \right) + \rho' P_{v,07} + \eta' V_{v,07} + \zeta' F_{f,07} + \varepsilon_{f,v}. \tag{6}$$

Consistent with my initial hypothesis, I find that wealth shocks have no effect on firm employment growth when the ratio is either very small or considerably larger than 100%. While a 100% loss for owners with large wealth relative to the firms financing needs would likely constrain them, the owners in my sample rarely experience stock market losses exceeding 50% of financial wealth. This heterogeneity is similar to that reported by Bahaj, Foulis, and Pinter (2020). ¹⁶ As I quantify in section H, these findings suggest that the aggregate sensitivity of employment to owners' wealth will be muted by the extent that many firms have owners who have too little wealth to credibly provide financing to their firms even in the absence of an adverse wealth shock.

Figure III: DIFFERENTIAL EFFECTS OF WEALTH SHOCKS ON EMPLOYMENT GROWTH

BASED ON RELATIVE INVESTOR-FIRM SIZE

This figure shows the differential effects of wealth shocks on firm employment growth for different bins of the ratio of an owner's Gross Financial Wealth (GFW) to the firm's operating expenditures (OpEx). Point estimates come from estimating equation 6. Vertical lines provide 95% confidence intervals.



¹⁶Bahaj, Foulis, and Pinter (2020) find that housing wealth shocks experienced by a firm's directors only affect investments when housing wealth accounts for a meaningful share of the firm's potential financing needs. They employ the cutoff that home values must exceed 15% of the firm's assets.

In the remaining analyses, where I consider the effects on employment and investment outcomes, I restrict my sample to firm-owner pairs where the GFW of the owner is between 25% and 175% (100% \pm 75%) of the firm's average operating expenditures in 2006 and 2007. It is not obvious which exact cutoffs to use, therefore I show how the main employment effect varies when altering these cutoffs in Internet Appendix Table XI.¹⁷

C Baseline Effects on Employment

In Table IV, I report the main results on the employment effects of owner wealth shocks. This baseline analysis considers the effect on employment growth during 2008–10. I show the effect of varying this time horizon in Section E. The results from the preferred empirical specification are presented in column (6). This demonstrates a substantial elasticity of employment growth to the owner's Gross Financial Wealth (GFW) of 0.49. I find that the estimated coefficient, $\hat{\beta}$, is robust to changes in the set of controls. In column (7), I find that that standard errors shrink when I two-way cluster on firm's 3 digit industry (114 clusters) code and the largest firm in the owner's portfolio (88 clusters), as opposed to on the firm (F) and investor (V) level in columns (1) through (6).¹⁸

One important take-away from traveling from column (1) to column (8) is that my estimated coefficient grows consistently, albeit only slightly, when adding more fine-grained industry and geographic controls. If my results were confounded by industry, regional or industry-region shocks, I would expect to see a noticeable decrease rather than increase in estimated coefficient on Gains/GFW when adding fixed effects to account for these confounders. The largest change is observed when I initially introduce 2-digit industry fixed effects in column (3), which suggests that correlations between stock returns and industry shocks are slightly negative rather than positive. Internet Appendix Table XII reveals virtually no change in the estimated coefficient on wealth shocks when introducing even more fine-grained (4- and 5-digit NACE codes) industry classification fixed effects. To address the concern that the control-variables approach does not accurately address potential confounders, I employ both a generalized propensity-score approach as well as a more granular fixed effects approach (with respect to portfolio exposure) in Internet Appendix Table XX.

¹⁷The main finding here is that the estimated effect shrinks quickly when lowering the lower cutoff. This is because the sample density is higher at the lower end, which implies that we quickly fill the sample with owner-firm pairs in which the owner was not already a viable financier. This is consistent with the findings in Figure III above.

¹⁸I cluster on the level of the largest firm in an owner's portfolio to explore whether accounting for correlated returns across investors may influence the standard errors.

Table IV: Main Employment Regressions: The Effects of Wealth Shocks on Employment Growth From 2007 to 2010

$EG_{07,10}^{D}$	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
$Gains_{08-09}/GFW_{07}$	0.323* (0.188)	0.332* (0.181)	0.435** (0.182)	0.452** (0.184)	0.458** (0.187)	0.493** (0.193)	0.493** (0.194)	0.514** (0.203)
Stocks/GFW	0.027 (0.086)	-0.015 (0.185)	0.049 (0.181)	0.048 (0.180)	0.012 (0.181)	-0.070 (0.189)	-0.070 (0.213)	0.046 (0.249)
$(Stocks/GFW)^2$		0.064 (0.232)	0.042 (0.221)	0.037 (0.221)	0.102 (0.217)	0.231 (0.227)	0.231 (0.320)	0.092 (0.309)
Profitability						0.311*** (0.118)	0.311*** (0.113)	0.212 (0.150)
Leverage (ST)						0.183** (0.084)	0.183** (0.090)	0.179* (0.101)
Leverage (LT)						-0.079 (0.089)	-0.079 (0.079)	-0.069 (0.113)
$\log(Assets)$						0.075*** (0.028)	0.075** (0.029)	0.070** (0.035)
Cash/OpEx						-0.176*** (0.064)	-0.176** (0.078)	-0.079 (0.079)
Lagged 1-Yr E.G.						-0.099** (0.041)	-0.099** (0.038)	-0.105** (0.047)
GFW/OpEx	[0.25, 1.75]	[0.25, 1.75]	[0.25, 1.75]	[0.25, 1.75]	[0.25, 1.75]	[0.25, 1.75]	[0.25, 1.75]	[0.25, 1.75]
P, F, V controls	-	-	-	-	-	Y	Y	Y
FE	-	-	NACE2	$_{ m NACE2,R}$	$_{ m NACE3,R}$	$_{ m NACE3,R}$	$_{ m NACE3,R}$	NACE $3 \times R$
Cluster	$_{\mathrm{F,V}}$	$_{\mathrm{F,V}}$	$_{\mathrm{F,V}}$	$_{\mathrm{F,V}}$	$_{\mathrm{F,V}}$	$_{\mathrm{F,V}}$	NACE3,LS	$_{\mathrm{F,V}}$
R2	0.0023	0.0023	0.0376	0.0490	0.0852	0.1341	0.1341	0.3121
N	2521	2521	2520	2520	2496	2496	2496	2099

The main coefficient of interest is that on $Gains_{08-09}/GFW_{07}$, which is amount of stock market gains the investor experienced during 2008 and 2009, fixing portfolio weights in 2007, scaled by 2007 Gross Financial Wealth. Stocks/GFW is over-all stock market exposure. Columns (1) through (6) and (8) gradually introduce more control variables and fixed effects. ST and LT refer to short-term and long-term liabilities, respectively. Cash/OpEx is the sum of bank deposits and cash scaled by the average of the firm's past 2-year operating expenditures. Standard errors in all columns except (7) are two-way clustered at the firm and investor level. The samples include approximately 2,250 firms and 2,320 owners. In column (7), standard errors are two-way clustered at the firm's 3 digit industry (114 clusters) and the largest firm in the owner's portfolio (88 clusters). Standard errors are reported in parentheses. *, ***, and *** indicate significance at the 10%, 5%, and 1% levels, respectively.

D Heterogeneity in Employment Effects

I estimate the heterogeneous effects of wealth shocks along the dimensions of profitability, liquidity (as measured by Cash/OpEx), and leverage. In these analyses on real outcomes, I also consider heterogeneity with respect to firm age. The motivation for this is that a given owner-financing shock may have stronger effects on younger firms, since they may find it harder or costlier to substitute towards other sources of financing. This suggests that a given owner-provided fi-

nancing shock has a larger over-all effect on financing for younger firms, which may translate into stronger effects on employment growth and investment.

In order to estimate the heterogeneous effects, I run the following regressions, interacting my shock and exposure measure with one or multiple variables, x, while retaining the original set of control variables.

$$EG_{07,10}^{D} = \alpha_{n} + \alpha_{r} + \beta \frac{Gains_{v,08,09}}{GFW_{v,07}} + \Gamma \left(\frac{Stocks_{v,07}}{GFW_{v,07}} \right)$$

$$+ \sum_{x} \left[\xi_{x} \cdot x + \beta_{x} \cdot x \cdot \frac{Gains_{v,08,09}}{GFW_{v,07}} + \Gamma_{x} \left(\frac{Stocks_{v,07}}{GFW_{v,07}} \right) x \right]$$

$$+ \rho' P_{v,07} + \eta' V_{v,07} + \zeta' F_{f,07} + \varepsilon_{f,v}.$$
(7)

Table V: Heterogeneous effects of wealth shocks on employment growth

$EG_{f,07,10}^{D}$	(1)	(2)	(3)	(4)	(5)	(6)	(7)
$Gains_{08-09}/GFW_{07}$	0.493**	0.133	0.569*	0.254	0.477	0.519**	0.184
	(0.193)	(0.188)	(0.333)	(0.279)	(0.321)	(0.203)	(0.398)
* Firm Age < 10		1.013**					0.774*
		(0.401)					(0.402)
* Profitability $< 10\%$			-0.098				-0.341
			(0.394)				(0.452)
* Cash/OpEx $< 10\%$				0.519			0.593
				(0.372)			(0.447)
* Leverage $> 50\%$					0.036		0.061
					(0.403)		(0.400)
* log(Employees), demeaned						0.089	0.076
						(0.193)	(0.193)
P, F, V Controls	Y	Y	Y	Y	Y	Y	Y
FE	NACE3,R						
R2	0.1341	0.1370	0.1346	0.1434	0.1343	0.1543	0.1656
N	2496	2496	2496	2496	2496	2496	2496

Coefficients are estimated using equation 7. Interaction terms are all 2007 valued. Standard errors are two-way clustered at the firm and investor level and are reported in parentheses. *, **, and *** indicate significance at the 10%, 5%, and 1% levels, respectively.

I report the results of these regressions in Table V. I find no statistically significant differences when considering profitability, liquidity, or leverage. This lack of heterogeneity is not too surprising. Firstly, while profitability may imply higher ability to self-finance out of retained earnings, profitability may also proxy for investment opportunities and thus make it more sensitive to

 $[\]overline{{}^{19}\Gamma_x(a)x} \equiv \gamma_{1,x}a \cdot x + \gamma_{2,x}a^2 \cdot x$. I thus estimate the slopes on the interaction between each x and stock market exposure and squared stock market exposure.

changes in the supply of finance from owners. Secondly, the same argument may apply to liquidity, to the extent that the firm is hoarding cash in expectation of upcoming investment opportunities. Thirdly, while more levered firms may be more adversely affected by a contraction in credit supply if lenders discriminate against more levered borrowers—more levered firms may also have superior creditor relationships, and thus be better positioned to substitute toward bank financing.

The theoretical predictions on how wealth shocks interact with firm age are perhaps less ambiguous. Younger firms have had less time to signal their quality and less time to develop relationships with external financiers. To the extent that firms grow toward their long-run optimal size over time, there is also reason to suspect younger firms still face positive-NPV investment opportunities on average. Consistent with this, I find that the effect of wealth shocks interacts strongly with firm age, and that the average effect on employment growth is almost entirely driven by firms less than 10 years old.²⁰

E Cumulative Employment Effects

In this subsection, I explore the effects of wealth shocks on cumulative employment growth. It is not obvious whether employment effects are persistent. Improvements in demand for goods and credit supply may allow firms to substitute towards other sources of financing and grow back on track. However, some profitable projects might not reappear. If shocked firms had to permanently let go of these, they might remain below their pre-crisis trajectory indefinitely. Some employment opportunities may also not reappear. Firms may therefore have had to pass on hiring individuals with skills that are in scarce supply.

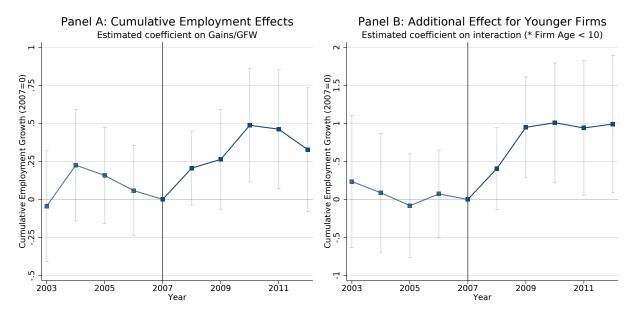
My analyses reveal rather persistent effects, particularly for younger firms who account for most of the employment effect. Panel (B) of Figure IV reports the coefficients on the interaction between Gains/GFW and $Firm\ Age < 10$. This effect does not appear to subside. The point estimates for cumulative employment growth from 2007 to 2010 are the same as those for 2007 to 2012, with the latter remaining statistically significant at the 5% level.

The finding that the (differentially) adverse effects on employment growth last at least 5 years is consistent with Schmalz, Sraer, and Thesmar (2017) who find persistent (8-year) intensive margin effects of housing wealth on employment outcomes for newly created French firms. In the literature on credit market contractions and employment growth, there are varying results on the duration of bank-lending induced financial shocks on employment. Popov and Rocholl (2018) find effects that dissipate within 3 years among German firms connected to less healthy banks during the Financial Crisis. Chodorow-Reich (2014) find that 3-year effects are similar to 2-year effects among mostly larger U.S. firms whose previous lenders reduced credit supply during the Financial Crisis.

²⁰10 years is the same threshold as used by Rajan and Zingales (1998) to distinguish the external financing needs of young and mature firms. In their context 10 years is the cutoff for time since IPO.

Figure IV: Cumulative Effects of Owner Wealth Shocks on Employment Growth

Panel (A) plots the coefficients on $Gains_{08-09}/GFW$ in regressions of cumulative employment from year t to 2007, $EG_{07,t}^D$. The point estimate for 2010 is analogous to the main estimate in column (6) in Table IV. Panel (B) similarly plots the coefficient on the interaction term Firm Age < 10. The point estimate for 2012 equals the estimate provided in column (2), Table V. Dashed blue lines provide 95% confidence intervals.



These analyses also allow me to address potential identification concerns. For example, investors who lost a large amount of their wealth during the crisis may have taken on significant risks, both in public and private equity. This might suggest that these investors expanded more rapidly before the crisis, and thus had to reduce their employment growth more following the onset of the crisis. An additional, but related, concern is that these investors had invested in both private and listed firms that were highly procyclical. Both of these concerns would suggest that more shocked firms had higher employment growth prior to experiencing wealth losses during 2008 and 2009. I do not find this to be the case. In Panel (A) of Figure IV below, I do not find that more shocked firms experienced higher cumulative growth rates between 2003 and 2007. Importantly, Panel (B) shows that younger shocked firms, who produce most of the effect on employment, do not display any pre-trends in employment growth.

In studying cumulative responses, a natural question that arises is how they vary with the persistence of the wealth shock. A regression of 1-year forward returns as of 2007 on 1-year forward returns as of 2008, allowing coefficients to vary by year, reveals a strong negative correlation of -1.13. In other words, 2008 returns were extraordinarily transitory. In Internet Appendix Figure VI I examine how these largely-transitory 1-year wealth shocks affected employment growth. We immediately see that the effects are much less precisely estimated. This relates to the significantly smaller variance in 1-year (2008) versus two-year (2008 and 2009) returns. Interestingly, we see

that the cumulative effects for the average firm are quite similar.

F Decomposing Employment Growth into Firing and Hiring

In this subsection, I exploit the detailed nature of the employer-employee register to decompose employment growth into separations and new hires. To my knowledge, the literature on financial frictions and employment has provided little evidence on how financial frictions may affect these two components of employment growth differently. While separating workers from the firm may mitigate financing short-falls by reducing payroll costs, and have longer-term positive effects on average productivity, it may have significant short-term costs due to potential legal costs and notice periods. Additional costs arise if workers walk away with the firm's intangible capital (Sun and Xiaolan, 2019). It is therefore unclear how attractive job separations are for financially constrained firms. A more attractive option is likely to curtail the hiring of new workers, which is typically associated with an initial training period and little immediate value added. This further allows firms to offer extensive-margin income insurance for their existing employees.

My results are consistent with this intuition. I find that approximately three-quarters of the effect on employment growth is through hiring, and that I cannot reject the null of no effect on job separations.²² Columns (1)-(2) show the baseline (reference) results that have employment growth variable as the dependent variable. Columns (3)-(4) focus on new hires and columns (5)-(6) consider existing workers. Comparing columns (1), (3) and (5), I find that most of the effect is driven by new hires. The coefficient on growth attributable to new hires makes up 74% of the coefficient on over-all employment growth. While I cannot rule out an economically meaningful effect on job separations in younger firms in column (6), the results in column (4) indicate that the reduction in hiring among younger firms is the primary driver of the average elasticity uncovered in column (1).

These findings suggest that the adverse effects of shocks to business owner wealth do not pass through to pre-existing workers along the extensive margin. The employment summary statistics in Internet Appendix Table VI show that while the average employment growth is -2.8% from 2007 to 2010, this is (essentially) the sum of considerable hiring (26%) and separations (-29%). This high degree of turnover presents an opportunity for firms to reduce the strain of employment costs by curtailing hiring and thereby insure existing workers on the extensive margin. These findings are consistent with Risch (2019) who finds that adverse shocks to business owners, operating through

²¹A concurrent paper by Barbosa, Bilan, and Célérier (2019) also uses this decomposition to look at the effects of credit supply on human capital retention and acquisition.

²²I decompose the numerator in the employment growth variable ($\Delta \#$ Non-owner Employment Days) into new hires ($\Delta \#$ Non-owner Employment Days for workers not present at time t) and existing workers ($\Delta \#$ Non-owner Employment Days for workers present at time t). I keep the denominator the same as before, containing the total number of employment days.

their personal income taxes, lead to intensive but not extensive margin effects on existing workers' compensation.

Table VI: The Effect of Wealth Shocks on Employment Growth during 2008–10 Decomposed into Changes Among Existing and New Workers

		Change in denominator limited to								
	EG_{0}	$EG_{07,10}^{D}$		Hires	Existing Workers					
	(1)	(2)	(3)	(4)	(5)	(6)				
$\mathrm{Gains}_{08-09}/\mathrm{GFW}_{07}$	0.493** (0.193)	0.133 (0.188)	0.357*** (0.137)	0.109 (0.129)	0.114 (0.123)	0.016 (0.160)				
* Firm Age <10		1.013** (0.401)		0.738*** (0.258)		0.232 (0.263)				
GFW/OpEx	[0.25,1.75]	[0.25,1.75]	[0.25,1.75]	[0.25,1.75]	[0.25,1.75]	[0.25,1.75]				
P, F, V controls	Y	Y	Y	Y	Y	Y				
FE	NACE3,R	NACE3,R	NACE3,R	NACE3,R	NACE3,R	NACE3,R				
R2	0.1341	0.1370	0.1857	0.1898	0.2030	0.2053				
N	2496	2496	2496	2496	2496	2496				

Standard errors are two-way clustered at the firm and investor level and are reported in parentheses. *, **, and *** indicate significance at the 10%, 5%, and 1% levels, respectively. Columns (1)-(2) correspond to my main employment specification and are provided as a reference. In columns (3)-(4) I only use the change in employment arising from new hires, that is, employees that were not present at time t = 2007. In columns (5)-6) I only consider changes in employment arising from workers who were present at time t = 2007. The dependent variables in columns (3)-(4) and (5)-(6) sum up to the dependent variable in columns (1)-(2) for approximately 99% of the observations, some deviations occurs due to separate winsorization.

I also explore how wealth shocks affect the composition of the firm's work force in terms of educational attainment. A recent empirical literature documents that workers, especially highly-educated ones, are less willing to work for financially distressed firms (see, e.g., Brown and Matsa 2016 and Baghai, Silva, Thell, and Vig forthcoming). While I find no effect on average (see Internet Appendix O), I find that adversely-shocked young firms reduce the fraction of college-educated workers in their firm, and that this effect comes from hiring rather than separations. Interestingly, adversely-shocked older firms appear to increase the education level of new hires, perhaps driven by more subcontracting.

G Effects of Owner Wealth Shocks During Different Time Periods

The goal of this paper is to further our understanding of the economic challenges facing private firms during a crisis. Smaller firms often rely heavily on their owners for financing, which may prove particularly problematic when the ability of owners to provide financing is shocked at the same time as internal cash-flows dissipate and other sources of financing contract.²³ The financial crisis of 2008 and 2009 provides a natural laboratory for such a study. In particular, it allows us to

²³See, e.g., Boualam and Mazet-Sonilhac (2020), who highlight the procyclicality in bank-lending relationships.

provide empirical evidence useful for guiding policies aimed at reducing the severity of widespread economic shocks.

Table VII: THE EFFECTS OF WEALTH SHOCKS ON SUBSEQUENT EMPLOYMENT GROWTH DURING DIFFERENT TIME PERIODS

	EG_0^j	D 05,08	EG	D 07,10	EG	D 09,12	
	t=2005		t = 2007	(baseline)	t=2009		
	(1)	(2)	(3)	(4)	(5)	(6)	
$Gains_{t+1} _{-t+2}/GFW_t$	-0.015	-0.046	0.493**	0.133	0.083	0.006	
	(0.106)	(0.134)	(0.193)	(0.188)	(0.157)	(0.193)	
* Firm Age <10		0.077		1.013**		0.177	
		(0.233)		(0.401)		(0.337)	
GFW/OpEx	[0.25,1.75]	[0.25,1.75]	[0.25,1.75]	[0.25,1.75]	[0.25,1.75]	[0.25, 1.75]	
LaggedOutcome	Y	Y	Y	Y	Y	Y	
P, F, V controls	Y	Y	Y	Y	Y	Y	
FE	NACE3,R	NACE3,R	NACE3,R	NACE3,R	NACE3,R	NACE3,R	
R2	0.1448	0.1467	0.1341	0.1370	0.1137	0.1140	
N	2212	2212	2496	2496	2721	2721	

Coefficients are estimated using equation 4. $Gains_{t+1-t+2}/GFW_t$ is amount of stock market gains the investor experienced during t+1 and t+2, fixing portfolio weights at the end of year t, scaled by year t GFW. In columns (1)-(2) t=2005, in columns (3)-(4) t=2007, and in columns (5)-(6) t=2009. Firm age, and all other controls measured at time t. Standard errors are two-way clustered at the firm and investor level and are reported in parentheses. *, ** and *** indicate significance at the 10%, 5%, and 1% levels, respectively.

However, the presence of financial frictions can lead firms to be reliant on the entrepreneur's personal financial resources even in normal times. While this has been studied extensively in the context of entrepreneurial entry, there exists much less evidence on the effects of adverse shocks to owner's financial situation and the economic outcomes of existing firms. To further our understanding of the passthrough of owner wealth shocks in normal times as well, a natural extension of this paper's analysis is to use the empirical framework to study the effects of stock-portfolio induced wealth shocks outside of the financial crisis. The natural hypothesis is that the effects will be muted relative to the financial crisis. Firstly, more stable cash flows may lower the need for outside financing. Secondly, alternative sources of finance may be more readily available. There may be more willingness to provide equity or loans among outside investors and banks, and suppliers may be more flexible in their payment schedules.

I extend my analysis in this direction by rerunning the main regressions during two alternative time periods.²⁴ The results are reported in Table VII. Columns (1)-(2) consider the pre-crisis period, and provide the estimated effect of wealth shocks experienced during 2006-07 on concurrent

²⁴Since security-level data on listed stocks is only available starting in 2004, I am unable to consider other economic crises, such as the one following the burst of the IT bubble in the early 2000s.

outcomes. Columns (3)-(4) provide the results for the financial crisis as a benchmark. Columns (5)-(6) consider the post-crisis period.

Interestingly, I find no statistically significant effects outside of the financial crisis. This can either be due to differences in the economic environment or differences in the distribution of wealth shocks across these periods, as 05-07 stock returns were largely positive, 07-09 mostly negative, while 09-11 were mixed. To examine potential asymmetric effects, I estimate a third order polynomial in the wealth shock variable, Gains/GFW, for the analysis covering 09-11. This reveals no evidence of any particular asymmetries.²⁵

The finding of a null effect outside the financial crisis does not imply that the personal financial resources of an entrepreneur is generally immaterial for firm outcomes. The point estimates for the effects for younger firms are positive for both the pre- and post-crisis periods, and economically important effects may be hidden inside the confidence intervals. I can only conclude that the pass-through of economic shocks is likely considerably smaller in normal times.

H Discussion of Macroeconomic Magnitudes

There are three findings that are particularly useful in understanding the partial equilibrium aggregate employment sensitivity to owner wealth shocks during an economic crisis. (i) Figure III shows that the effect is limited to owner-firm pairs for which the owner's wealth is material relative to the potential financing needs of the firm. (ii) Table V shows that the employment effect is driven by young firms. (iii) the findings in Table V suggests that the effects do not vary by firm employment size once we condition point (ii). Informed by this, I use equation 7 to estimate how the effect varies by wealth relative to potential financing needs, firm age, and their interaction. ²⁶

I use the estimated coefficients to construct firm-level employment-wealth sensitivities as of 2007, e_f , and I find that the employment-weighted average for the full sample of privately-held firms is 0.12. This aggregate sensitivity is not trivial. Chodorow-Reich (2014) attributes one fifth to one third of the decline in U.S. employment in the year following the financial crisis to negative credit supply shocks. Yet, his in-sample sensitivity of employment growth to loan supply growth

$$EG_{07,10}^{D} = 0.32 \frac{Gains_{08-09}}{GFW_{07}} - 0.22 \frac{Gains_{08-09}}{GFW_{07}} \mathbb{1}[FirmAge < 10] - 0.26 \frac{Gains_{08-09}}{GFW_{07}} \frac{GFW_{07}}{OpEx07}$$

$$- 0.71 \frac{Gains_{08-09}}{GFW_{07}} \left(\frac{GFW_{07}}{OpEx07}\right)^{2} + 0.47 \frac{Gains_{08-09}}{GFW_{07}} \frac{GFW_{07}}{OpEx07} \mathbb{1}[FirmAge < 10] + \dots$$

$$(8)$$

²⁵The estimated coefficients (standard errors) on the first through third-order polynomial in Gains/GFW are 0.1359 (0.2404), 0.1064 (0.2566), and -0.2422 (0.3598), respectively. Plotting the treatment effects for different values of Gains/GFW does not reveal any significant asymmetries.

²⁶I use equation 7 to estimate heterogeneity with respect to $\frac{GFW_{07}}{OpEx07}$, $\mathbb{1}[FirmAge < 10]$, and their product. This produces the following estimates in the sample of firm-owner pairs where $\frac{GFW_{07}}{OpEx07} > 0.1$.

is about 0.05-0.07, and the sensitivity to banks' real-estate-induced asset losses is considerably smaller.²⁷

Total direct impact of stock market crash. I can calculate the total impact of the stock market crash on employment growth in privately-held firms under a few additional assumptions. (I) The effects of losses in directly-held stocks apply to losses from mutual fund holdings. (II) Portfolio returns above a benchmark 10% return has no employment effect. (III) I can infer average total (mutual fund + direct stocks) portfolio returns from direct stocks.²⁸ This is to address the data limitation that I do not observe portfolio-level mutual fund returns. Under these assumptions, I calculate the total employment growth effect as

$$\underbrace{\mathbb{E}^* \left[e_{f,v} \cdot \frac{mfund_v + stocks_v}{GFW_v} \right]}_{\text{Stock Market Exposure Weighted Sensitivities}} \underbrace{\mathbb{E} \left[(R_{v,07,09} - 10\%) | R_{v,07,09} < 10\% \right]}_{\text{Average of Returns below 10\%}} \mathbb{P}[R_{v,07,09} < 10\%], \quad (9)$$

where $(mfund_v + stocks_v)/GFW_v$ is the total stock market exposure (including mutual funds) as of 2007. The first-term thus provides the average employment-wealth sensitivity weighted by stock market exposure. \mathbb{E}^* indicates additional weighting by number of employees. The resulting sensitivity of 0.41% is multiplied by -32.76%, which is the average portfolio return of those who had a return below a benchmark of 10%. I assume no effect among those who gained more than 10%, thus the two first terms are multiplied by the probability that a given portfolio earns a below 10% return, which is 91.60%. This produces an over-all reduction in employment growth of 0.12 percentage points. If we zoom in on firms that were less than 10 years of age and had fewer than 10 employees, the reduction in employment growth is 0.21 percentage points. These effects are far from trivial, especially in light of the fairly low average total stock market share among Norwegian entrepreneurs of about 8%.

Policies or shocks may be scalable by income rather than financial wealth. For example, a potential policy tool for boosting entrepreneurs' liquidity is to allow them to delay the payment of their personal income taxes (Fagereng and Ring, 2021). This could bolster employment growth under the assumption that wealth shocks affect employment primarily through a liquidity effect, which is what my analyses suggest (see section \mathbb{C}). Suppose that business owners see a liquidity increase equal to l times their personal income in 2007. Extrapolating from my empirical results,

²⁷Chodorow-Reich (2014) finds that a decrease in credit supply of 80% (90th to 10th percentile) decreases employment growth by 4 to 5.5 percentage points. Hence the sensitivity of employment growth to lending growth is about 0.05–0.07. The first-stage regressions (see his Table III) imply an elasticity of lending to real estate charge-off induced drops in assets of about 0.1. This suggests an employment to bank wealth (i.e., assets) sensitivity of about 0.005-0.007.

²⁸While mutual funds imply higher diversification, Internet Appendix Table X finds no relationship between portfolio returns and HHI.

the employment growth would then increase by

$$\mathbb{E}^* \left[e_{f,v} \cdot \frac{\Delta Liquidity_v}{GFW_v} \right] = \mathbb{E}^* \left[e_{f,v} \cdot \frac{PersonalIncome_v \times l}{GFW_v} \right] = 0.0295l. \tag{10}$$

Hence, my findings suggest that delaying personal income taxes (assumed to be 40% of total income) would have increased employment growth during 2008–10 by almost 1.2 percentage points.

These magnitudes may be considered lower bounds rather than an expected partial-equilibrium effects. This is because my point estimates stem from firms that chose ex-ante to allocate considerable wealth to their stock portfolio rather than their private firms. This would presumably only occur if the firms were not financially constrained ex-ante. It should also be stressed that this type of extrapolation is subject to considerable uncertainty. There are relatively few very large employers in my main sample, which prohibits me from rejecting the hypothesis that large employers have very different employment to owner-wealth sensitivities. Furthermore, it is possible that in general equilibrium, the effects may be attenuated due to reallocation from constrained to unconstrained firms or even magnified due to aggregate expenditure effects (Chodorow-Reich, 2014).

I The Effect of Wealth Shocks on Capital Expenditures

In this section, I show that owner wealth shocks also lower investments, particularly among younger firms. Documenting this additional real effect is interesting because it sheds light on the hypothesis that financial frictions may be more severe for labor, and thus leave investments intact while employment growth goes down. There are at least two reasons why this is a plausible hypothesis. First, capital—as opposed to labor—may serve as collateral. Second, capital may not decide to leave or refuse to join the firm (Baghai et al. forthcoming, Brown and Matsa 2016, Babina 2020). Workers may be less willing to join due to an increased probability of unemployment or, for example, reduced investments in workplace safety (Cohn and Wardlaw, 2016).

The literature on credit market contractions and employment focuses almost exclusively on employment outcomes. The existing literature does not shed much light on whether labor and capital expenditures are materially affected in the same sample of firms, which is necessary to evaluate the above hypothesis. The empirical challenge is that data on capital expenditures is not always readily available in contexts where employment outcomes are. This challenge may be overcome in Norwegian register data, as all incorporated firms must report each year the transaction value of all investments and disinvestments in fixed assets, broken down by asset class.²⁹ This allows

²⁹See summary statistics in Internet Appendix Table V. The purpose of the investment (capex) reporting requirements is to facilitate the calculation of tax deductions based on asset depreciation. A positive cash flow inducing sale of a fully depreciated asset triggers taxes, and future depreciation allowances depend on the historical (transaction) cost of the asset. Up until 2011 these yearly figures were reported in the firm's main tax return form. After 2011 these numbers enter a separate form that is filed an appendix to the firm's tax return. This appendix is not part of my dataset.

me to analyze the effects on firm-level investments with minimal measurement error.

Table VIII: THE EFFECTS OF WEALTH SHOCKS ON FIRM INVESTMENTS DURING 2008 AND 2009

	Total	Investment / A	Assets	1[Net Inve	estment in Plant a	& Property > 0]
	(1)	(2)	(3)	(4)	(5)	(6)
$Gains_{08-09}/GFW_{07}$	0.106	-0.040	-0.134	0.224*	0.109	0.230
	(0.099)	(0.093)	(0.184)	(0.120)	(0.094)	(0.196)
* Firm Age < 10		0.439**	0.414*		0.400*	0.269
		(0.200)	(0.224)		(0.218)	(0.206)
* Profitability < 10%			0.601***			0.050
			(0.222)			(0.269)
* Leverage > 50%			-0.392*			-0.345*
			(0.217)			(0.208)
* Cash/OpEx < 10%			-0.207			0.185
			(0.235)			(0.226)
LaggedOutcome	Y	Y	Y	Y	Y	Y
GFW2OpEx	[0.25, 1.75]	[0.25, 1.75]	[0.25, 1.75]	[0.25, 1.75]	[0.25, 1.75]	[0.25, 1.75]
P, F, V controls	Y	Y	Y	Y	Y	Y
FE	$_{ m NACE3,R}$	$_{ m NACE3,R}$	NACE3,R	$_{ m NACE3,R}$	NACE3,R	$_{ m NACE3,R}$
R2	0.1670	0.1718	0.1803	0.3392	0.3438	0.3465
N	2129	2129	2129	2129	2129	2129

Columns (1) through (3) consider the effect on total investments during 2008 and 2009 scaled by 2007 assets. Columns (3) through (6) use a dummy variable for whether there were net positive investments in plant or property during 2008 or 2009. Coefficients are estimated using equation 7, using investment outcomes as left-hand-side variables. Standard errors are two-way clustered at the firm and investor level and are reported in parentheses. *, **, and *** indicate significance at the 10%, 5%, and 1% levels, respectively.

I first examine the effect of wealth shocks on investments in columns (1)-(3) of Table VIII. Column (1) shows an insignificant effect on average, but this masks significant heterogeneity with respect to firm age: Column (2) shows that a 10% wealth loss reduces the 2-year investment ratio by about 4.2 percentage points (or 0.32 standard deviations) for younger firms. The firm-age heterogeneity is robust to introducing additional interactions in column (3). In columns (4)-(6), I consider the effect on major capital expenditures events, such as investments in plants or new property.³⁰ In column (4), I find that a wealth loss of 10% lowers the probability of investments in Plant and Property by 2.5 percentage points, or by 35.7% relative to the mean probability of 0.07. In column (5), I find that this effect is again largely driven by younger firms. Column (6) re-introduces the additional interaction terms. This leaves the firm-age heterogeneity qualitatively intact, but the lack of significance implies that we cannot rule out that the firm-age heterogeneity

³⁰There are fairly few such events, with very large variation in the expenditures. This causes me to restrict my focus to investments on the extensive rather than intensive margin.

is driven by the fact that age is correlated with other observables.

IV Understanding the Mechanism

A Inability to Substitute to Bank-provided Financing

My results show that the real effects of owner wealth shocks are driven by younger firms. A potential explanation for this is that younger firms have had less time to develop relationships with potential external financiers, for example, banks, and are thus less able to substitute to external sources of financing. In Panel A of Table IX, I present results consistent with this intuition. For affected mature firms, bank loans appear to be a partial substitute for owner-provided financing, while for affected young firms, they appear to be complementary.³¹

In columns (1)-(2), I consider extensive-margin effects on long-term (LT) bank financing. This reveals significant substitution for the average firm, but much less so for younger firms. In columns (3)-(4), I consider intensive-margin effects on over-all bank financing. This reveals a more striking heterogeneity with respect to firm age. While mature firms are able to substitute toward long-term bank financing, younger firms are not—point estimates indicate a reduction in borrowing. Column (4) says that a mature firm whose owner loses 10% of his or her wealth sees an increase in the bank loan to asset ratio of 0.02, or approximately 40% relative to the the mean (conditional on a non-negative change) of 0.051.³² Young firms, on the other hand, decrease this ratio by approximately 52%.³³

While my main hypothesis relates to differences in equity to bank-debt substitution is related to supply-side factors, a complementary explanation for my findings is that the difference between equity and bank financing in terms of the costs of financial distress are larger for younger firms who thus choose to substitute less for precautionary reasons (Crouzet, 2018).

³¹See recent work by Fonseca and Wang (2021) who document similar age-heterogeneity in bank-owner financing occurring due to bank-credit supply shocks.

³²Conditional on having a non-negative change in over-all loans from 2007 to 2009, the mean change, scaled by 2007 assets is 0.051. Conditional on being strictly positive, the mean is 0.234.

³³-(0.203-0.468)*0.1/0.051

Table IX: Effects of Wealth Shocks on Bank- and Owner-provided Financing

Panel A: Bank Financing $\Delta \text{Long-term Bank Loans} > 0$ ΔAll Bank Loans/Assets₀₇ (1) (2)(3)(4)-0.229** -0.075 $Gains_{08-09}/GFW_{07}$ -0.239* -0.218* (0.114)(0.131)(0.099)(0.119)* Firm Age < 100.119 0.469*(0.268)(0.262)mean(Y) .116 .116 .008 .008 R20.15500.15860.14770.1540Ν 2349 2349 2349 2349

PANEL B: EQUITY-OWNERSHIP STRUCTURE

	Firm Owners	$hip Share_{2010} > 0$	Firm Owner	rship Share ₂₀₁₀
	(1)	(2)	(3)	(4)
$Gains_{08-09}/GFW_{07}$	-0.122	-0.022	0.003	-0.002
	(0.166)	(0.153)	(0.053)	(0.066)
* Firm Age < 10		-0.302		0.017
		(0.347)		(0.108)
R2	0.1412	0.1447	0.9034	0.9034
N	2285	2285	1970	1970
For both panels:				
GFW/OpEx	[0.25, 1.75]	[0.25, 1.75]	[0.25, 1.75]	[0.25, 1.75]
P, F, V controls	Y	Y	Y	Y
FE	NACE3,R	NACE3,R	NACE3,R	NACE3,R

Panel A considers the effect of wealth shocks on bank financing. Columns (1)-(2) consider the extensive-margin effect on obtaining long-term bank loans and columns (3)-(4) considers the effect on over-all changes in bank-provided financing, scaled by assets. The differences (Δ) refer to changes in bank loans over the two-year period between Dec 2007 and Dec 2009. In Panel (B), Only firms who have non-missing accounting data during both 2007 and 2009 are present. For Panel A, columns (3)-(4), conditional on having a non-negative change in over-all loans from 2007 to 2009, the mean change, scaled by 2007 assets is 0.051. Conditional on being strictly positive, the mean is 0.234. • Panel B considers the effect on equity ownership structure. Columns (1)-(2) examine the whether the shocked owner is still an owner in 2010. Columns (3)-(4) consider the effect on the owner's future (2010) ownership share, where substitution towards other equity investors would imply a positive coefficient. • Standard errors are two-way clustered at the firm and investor level and are reported in parentheses. *, ***, and *** indicate significance at the 10%, 5%, and 1% levels, respectively.

B No Substitution Toward Other Equity Investors

To inform the extent of substitution toward new equity investors, I examine the effects on the firm's equity-ownership structure Panel B of Table IX. In column (1)-(2), I examine whether they exit their equity position in the private firm they own, and find no evidence of this occurring. In

columns (3)-(4), I examine whether adversely-affected firms are able to engage new equity investors. Empirically, I consider the effect on the conditional ownership share of the affected owner. This reveals no effect, which is consistent with an inability of these firms to substitute toward external equity financing— as this would reduce the ownership share of the existing owner. I also find no heterogeneity with respect to firm age.

This heterogeneity analysis is important, because younger firms are the ones found to be the the least able to substitute toward bank-provided financing. A possible hypothesis would thus be that younger firms are differentially more likely to substitute toward equity investors, while older firms are more likely to substitute toward bank financing. However, I find that younger firms substitute toward neither of these financing sources. This is consistent with my results that younger firms experience the most severe real effects in terms of employment growth and investment.

Notably, this test of equity financing frictions is agnostic with respect to whether owners' liquidity, risk tolerance, or beliefs are diminished. For example, if the firm still has ample liquidity but the owner refuses to grow the firm due to diminished beliefs, the no-friction hypothesis is that firms would substitute toward new and unshocked investors who put a higher value the firms' investment opportunities.

C Liquidity, Wealth, or Updated Beliefs?

We may think of stock market losses as potentially affecting firm financing and growth through three channels. First, by reducing the amount of liquid wealth the owner has, the owner's *ability* to provide financing is reduced. In this case, the owner becomes financially constrained, which may cause the firm to become financially constrained as well. Second, to the extent that the owner's *risk tolerance* is affected through a wealth effect (Stiglitz, 1975), entrepreneurs may wish to allocate less capital to the financing and growth of their firms. Third, a growing body of evidence shows that adverse personal shocks may affect risk-taking through negatively-updated *beliefs* about the broader economy's trajectory.³⁴

It is conceptually challenging to disentangle the ability and risk-tolerance channels. Owners may suffer sizable losses in the stock market, but still have some liquid wealth left that they nevertheless are unwilling to allocate to the firm due to decreased risk-tolerance. In perfect capital markets, neither of these channels should affect real outcomes, as financing for the firm is readily

³⁴E.g., Kuchler and Zafar (2019) show that idiosyncratic, personal experiences affect expectations about aggregate outcomes; Adelino et al. (2018) show that local house price shocks affect the perceived riskiness of housing; Andersen et al. (2019) show that negative personal shocks affected risk-taking during the financial crisis; Guiso et al. (2018) find that the financial crisis increased individuals' risk aversion; Pool et al. (2019) find that house price shocks affects fund managers' decisions; Laudenbach et al. (2021) find that uninformative local economic shocks affect trading behavior through a belief rather than wealth effect; Kaustia and Knüpfer (2008) show that individually experienced past returns affect the propensity to subscribe to future IPOs.

available elsewhere. In the presence of financial market frictions, both channels may render the firm unable to pursue profitable projects. However, from a policy or economic modeling perspective, it is useful to know at which level (entrepreneur or the firm) the financial constraints appear. For example, during financial crises, policy makers may wish to directly support firms' financial situation if the risk-tolerance channel is the most important. It is further useful to document the potential extent of belief effects. If firms reduce employment growth primarily due to downgraded beliefs, policies that facilitate the transition of ownership away from adversely-affected owners would presumably be more useful than boosting banks' credit supply.

Table X: Stock Market Wealth Shocks and Subsequent Portfolio Adjustments

	Δ Portfolio Var		$1[Stocks_{09} > 0]$		$\frac{\text{mutualfunds}_{09}}{\text{GFW}_{09}}$		$\frac{\Delta \mathrm{Safe\ Assets}}{\mathrm{GFW}_{07}}$	
	(1a)	(1b)	(2a)	(2b)	(3a)	(3b)	(4a)	(4b)
$\rm Gains_{08-09}/GFW_{07}$	0.005	0.004	-0.154	-0.035	-0.014	-0.015	0.057	0.043
	(0.008)	(0.008)	(0.118)	(0.122)	(0.021)	(0.024)	(0.141)	(0.203)
* Firm Age < 10		0.001		-0.266		-0.001		-0.044
		(0.013)		(0.228)		(0.047)		(0.269)
GFW/OpEx	[0.25, 1.75]	[0.25, 1.75]	[0.25, 1.75]	[0.25, 1.75]	[0.25, 1.75]	[0.25, 1.75]	[0.25, 1.75]	[0.25, 1.75]
R2	0.1317	0.1334	0.1121	0.1148	0.3109	0.3111	0.1085	0.1103
N	2309	2309	2496	2496	2483	2483	2483	2483

Column (1) considers the effect on changes in the stock portfolio variance from 2007 to 2009. For this exercise, the variance is computed using time t portfolio weights, but returns for years 2002-2013, to calculate the total portfolio variance with respect to monthly returns. Column (2) examines the extensive-margin effect on direct listed stock ownership. Column (3) considers the effect on the portfolio share allocated to mutual funds. Column (5) considers the effect on safe-asset (deposits and bonds) accumulation from 2007 to 2009, scaled by 2007 GFW. Δ measures two-year differences from 2007 to 2009. Regression specification includes full set of P, F, and V controls and NACE3 and region fixed effects. Standard errors are two-way clustered at the firm and investor level and are reported in parentheses. *, **, and *** indicate significance at the 10%, 5%, and 1% levels, respectively. $Gains_{08-09}/GFW_{07}$ is amount of stock market gains the investor experienced during 2008 and 2009, fixing portfolio weights in 2007, scaled by 2007 GFW.

Non-firm Portfolio Adjustments to Wealth Shocks. If entrepreneur's risk tolerance or beliefs are materially affected, I would expect to see reduced risk taking in their stock-market portfolios. I therefore analyze several margins of portfolio adjustment. First, I study whether investors tilt their portfolio towards safer assets by exploring the effect on their portfolio variance. Existing evidence shows that wealth shocks may affect within-asset class portfolio composition (Paravisini et al., 2017). Second, I explore whether losses induce a stock market exit, as several studies show that belief and wealth shocks have important extensive-margin effects on risk taking

³⁵For this exercise, I limit the direct effect of realized 2008–09 returns on the variance by using the same time series of individual stock returns (2002-2013) and only allow individual portfolio weights to vary with time.

(see, e.g., Knüpfer et al. 2017; Malmendier and Nagel 2011; Briggs et al. 2021). Third, I explore the effect on the risky share of financial wealth, which is shown to be affected by adverse experiences (see, e.g., Andersen et al. 2019; Hanspal et al. 2021; Laudenbach et al. 2021), wealth shocks (Calvet et al., 2009), 36 and income shocks (Meeuwis, 2020). Since portfolio losses mechanically reduce the risky share of slow-to-rebalance investors, I consider the risky share when defining only mutual funds as being the risky asset class. Fourth, I consider the effects on the accumulation of safe assets. The idea here is that if wealth shocks severely affect entrepreneurs' risk aversion, entrepreneurs may defund their firms in order to accumulate more safe assets. While these tests are useful for assessing the scope of risk-tolerance and belief effects, they cannot rule them out due to, for example, inertia in portfolio optimization (Brunnermeier and Nagel, 2008).

I report these results in Table X. Here, I also consider firm-age heterogeneity, since my results indicate that younger firms transmit the real effects of losses. Interestingly, there is no evidence of any portfolio composition effects. This is not necessarily inconsistent with the literature cited above, as effects may be particularly small for likely-risk-tolerant entrepreneurs and hence statistically challenging to discern in my sample. Nevertheless, these results are hard to square with reduced risk tolerance or negatively-affected beliefs being the main mechanism behind my results. The main findings in this paper indicate that entrepreneurs defund their firms at the cost of slowing employment growth and reducing investments. Yet, the entrepreneurs do not reduce the risk they take in their stock portfolios to an extent that I can statistically infer, which I would expect to be the first-order effect if their willingness to take risk is severely affected by the stock market losses.

Belief channel. Kaustia and Knüpfer (2008) and Anagol, Balasubramaniam, and Ramadorai (2021) find that past returns affect future investments through a belief-updating channel. In support of a belief channel, they show that past returns affect investment behavior regardless of the impact on wealth. This suggests an additional test to judge the presence of belief effects. I repeat two of the main analyses when including both returns as well as the relative wealth loss as explanatory variables. I find that only the wealth shock matters (see Internet Appendix Table XIX), which suggests a smaller role for the belief channel in my sample of entrepreneurs.

V Discussion

Entrepreneurs and equity investors' wealth are subject to a wide range of cash-flow and assetprice shocks that can inhibit their ability or willingness to provide financing. Such shocks include the value and cash-flows of their investments in (other) firms, the stock market, real estate, and other financial instruments, as well as taxation. Many of these shocks will be tightly correlated to

³⁶See also Chiappori and Paiella (2011) who find no relationship between wealth changes and the risky share.

the investment opportunities of their private firms. Adverse wealth shocks are particularly likely to occur during economic crises, and therefore coincide with reductions in demand and credit supply from financial institutions. In this paper, I use variation in stock market wealth. I exploit differences in pre-crisis portfolio compositions and the large dispersion in stock returns during the two-year period of 2008 and 2009, in an attempt to keep firms' investment opportunities constant while still obtaining meaningful variation in wealth and liquidity. This allows me to present new evidence on how small, and especially young, firms are affected by shocks to their owners' wealth during an economic crisis. I show that these shocks can have economically large effects on employment and investment. A multitude of tests are inconsistent with these effects being driven by confounding due to, for example, selection on investor characteristics or common shocks.

Causal effects of wealth shocks on firm outcomes may operate through at least three channels. First, adverse wealth shocks reduce the entrepreneurs' liquidity and hence their ability to finance their firms. Second, a reduction in wealth may lower the entrepreneur's effective risk tolerance. Third, experiencing negative wealth shocks may cause entrepreneurs to negatively update their beliefs about the broader economy's trajectory. Both reduced risk-tolerance and diminished beliefs may dissuade entrepreneurs from financing and growing their firms. In frictionless financial markets, however, none of these channels should play a role: profitable investments are undertaken regardless of idiosyncratic shocks to existing equity holders. Nevertheless, from a policy or economic modeling perspective, it is useful to document which channel appears to be the primary driver. If the liquidity effect is the most important, general policies aimed at boosting the supply of capital may be the right remedy. However, if wealth or belief effects are the most important, policies aimed at bolstering credit supply may be ineffective. Taking on more bank debt may increase the riskiness of the firm and does not necessarily cure pessimistic beliefs. While decomposing these channels is challenging, I perform number of tests whose results do not emphasize downgraded beliefs of reduced risk-tolerance as being the main channels in my setting.

My findings underline the importance of owners in financing investment and employment in small firms in a recessionary economic environment. Greenstone, Mas, and Nguyen (2020) find that small firms are largely unaffected by contractions in small business lending, suggesting that small firms may have access to other sources of credit when bank lending contracts. This may be consistent with an absence of procyclical financial constraints for smaller firms; a hypothesis which my findings reject. My analyses further reveal sizable effects that are rather persistent for younger firms. This suggests that younger firms who lose out on investment or employment opportunities due to financial frictions do not catch up in the short to medium term. Given the importance of small businesses in most economies and the fact that they often rely heavily on owners (rather than banks) for financing, these findings stress that policymakers should consider policy responses to adverse economic shocks that go beyond securing bank credit. Examples include policies that lead

to (i) increased provision of loans to small, young businesses or to their owners, or (ii) increased incentives for investors to provide equity financing to these firms.

My identification strategy obtains variation in entrepreneurial wealth from entrepreneurs who were likely unconstrained prior to the crisis. In many models with financial frictions, the entrepreneur allocates all of her wealth to the firm. The fact that my entrepreneurs held significant non-firm wealth prior to the crisis suggests that financial constraints were not binding. This could be because the firm had easy access to other sources of financing or that the expected rate of return was at or below that of the stock market. This implies that my results may be particularly useful for understanding how firms transition from non-binding to binding financial constraints, which is likely to occur for many firms during financial crises. In extrapolating to other economic environments, the adverse effects may also be attenuated whenever it is easier to substitute toward bank financing, as section IV suggests. However, it is unclear how strong this attenuation would be.³⁷ For example, the findings in Crouzet (2018) suggests that private firms would not fully substitute toward bank financing. This is because bank finance presumably comes with a higher cost of financial distress than equity finance.

Finally, this paper contributes to research on financial frictions and wealth inequality (Cagetti and De Nardi 2006 and Quadrini 2000). In frictionless financial markets, financing for profitable projects should be readily available, despite any adverse effects of wealth shocks on the liquidity or risk-tolerance of entrepreneurs. Whether firm financing and real outcomes materially depend on the personal wealth of owners therefore provides a test of the severity of financial frictions in equity markets. These frictions—rather than those in debt markets—are found by Peter (2020) to be key in determining of the level of wealth inequality. Furthermore, my findings indicate that less-wealthy entrepreneurs may be at a significant disadvantage in pursuing growth opportunities during a financial crisis. My findings thus highlight financial frictions as a channel through which economic crises may amplify wealth inequality.

References

Adelino, Manuel, Song Ma, and David Robinson, 2017, Firm age, investment opportunities, and job creation, *The Journal of Finance* 72, 999–1038.

Adelino, Manuel, Antoinette Schoar, and Felipe Severino, 2015, House prices, collateral, and self-employment, *Journal of Financial Economics* 117, 288–306.

³⁷Within my sample, I find no evidence of significant heterogeneity in employment effects with respect to changes in local bank credit growth: Internet Appendix Table XV shows a null interaction effect of wealth shocks with changes in municipality-level average bank loan growth. However, I cannot statistically rule out that a one-standard deviation decrease in local credit growth increases the employment effect by (up to) 45%. Focusing on younger firms, the estimated interaction is negative, economically meaningful but statistically insignificant.

- Adelino, Manuel, Antoinette Schoar, and Felipe Severino, 2018, Perception of house price risk and homeownership, Technical report, National Bureau of Economic Research.
- Anagol, Santosh, Vimal Balasubramaniam, and Tarun Ramadorai, 2021, Learning from noise: Evidence from india's ipo lotteries, *Journal of Financial Economics* 140, 965–986.
- Andersen, Steffen, Tobin Hanspal, and Kasper Meisner Nielsen, 2019, Once bitten, twice shy: The power of personal experiences in risk taking, *Journal of Financial Economics* 132, 97–117.
- Andersen, Steffen, and Kasper Meisner Nielsen, 2012, Ability or finances as constraints on entrepreneurship? evidence from survival rates in a natural experiment, *The Review of Financial Studies* 25, 3684–3710.
- Babina, Tania, 2020, Destructive creation at work: How financial distress spurs entrepreneurship, The review of financial studies 33, 4061–4101.
- Baghai, Ramin, Rui Silva, Viktor Thell, and Vikrant Vig, forthcoming, Talent in distressed firms: Investigating the labor costs of financial distress, *Journal of Finance*.
- Bahaj, Saleem, Angus Foulis, and Gabor Pinter, 2020, Home values and firm behavior, *American Economic Review* 110, 2225–2270.
- Barbosa, Luciana, Andrada Bilan, and Claire Célérier, 2019, Credit supply and human capital: Evidence from bank pension liabilities, *Working Paper*.
- Becker, Sascha O, and Hans K Hvide, 2019, Entrepreneur death and startup performance, Available at $SSRN\ 2199645$.
- Benmelech, Efraim, Nittai Bergman, and Amit Seru, 2021, Financing labor, *Review of Finance* 25, 1365–1393.
- Benmelech, Efraim, Carola Frydman, and Dimitris Papanikolaou, 2019, Financial frictions and employment during the great depression, *Journal of Financial Economics* 133, 541–563.
- Bentolila, Samuel, Marcel Jansen, and Gabriel Jiménez, 2018, When credit dries up: Job losses in the great recession, *Journal of the European Economic Association* 16, 650–695.
- Berglann, Helge, Espen R Moen, Knut Røed, and Jens Fredrik Skogstrøm, 2011, Entrepreneurship: Origins and returns, *Labour economics* 18, 180–193.
- Bernanke, Ben S, Mark Gertler, and Simon Gilchrist, 1999, The financial accelerator in a quantitative business cycle framework, *Handbook of macroeconomics* 1, 1341–1393.
- Berton, Fabio, Sauro Mocetti, Andrea F Presbitero, and Matteo Richiardi, 2018, Banks, firms, and jobs, *The Review of Financial Studies* 31, 2113–2156.
- Berzins, Janis, Øyvind Bøhren, and Bogdan Stacescu, 2020, Shareholder illiquidity and firm be-

- havior: Financial and real effects of the personal wealth tax in private firms, Working Paper
- Bjørneby, Marie, Simen Markussen, and Knut Røed, 2020, Does the wealth tax kill jobs?, Technical report, Institute of Labor Economics (IZA).
- Bø, Erlend E, Elin Halvorsen, and Thor O Thoresen, 2019, Heterogeneity of the carnegie effect, Journal of Human resources 54, 726–759.
- Boualam, Yasser, and Clément Mazet-Sonilhac, 2020, Aggregate implications of credit relationship flows: a tale of two margins, *Available at SSRN 3548327*.
- Briggs, Joseph, David Cesarini, Erik Lindqvist, and Robert Östling, 2021, Windfall gains and stock market participation, *Journal of Financial Economics* 139, 57–83.
- Brown, J David, John S Earle, and Yana Morgulis, 2015, Job creation, small vs. large vs. young, and the SBA, NBER Working Paper.
- Brown, Jennifer, and David A Matsa, 2016, Boarding a sinking ship? an investigation of job applications to distressed firms, *The Journal of Finance* 71, 507–550.
- Brunnermeier, Markus K, and Stefan Nagel, 2008, Do wealth fluctuations generate time-varying risk aversion? micro-evidence on individuals, *American Economic Review* 98, 713–36.
- Cagetti, Marco, and Mariacristina De Nardi, 2006, Entrepreneurship, frictions, and wealth, Journal of political Economy 114, 835–870.
- Calvet, Laurent E, John Y Campbell, and Paolo Sodini, 2009, Fight or flight? portfolio rebalancing by individual investors, *The Quarterly journal of economics* 124, 301–348.
- Cespedes, Jacelly, Xing Huang, and Carlos Parra, 2019, More cash flows, more options? the effect of cash windfalls on small firms, Technical report, Working paper.
- Chaney, Thomas, David Sraer, and David Thesmar, 2012, The collateral channel: How real estate shocks affect corporate investment, *American Economic Review* 102, 2381–2409.
- Chiappori, Pierre-André, and Monica Paiella, 2011, Relative risk aversion is constant: Evidence from panel data, *Journal of the European Economic Association* 9, 1021–1052.
- Chodorow-Reich, Gabriel, 2014, The employment effects of credit market disruptions: Firm-level evidence from the 2008–9 financial crisis, *The Quarterly Journal of Economics* 129, 1–59.
- Chodorow-Reich, Gabriel, Plamen T Nenov, and Alp Simsek, 2019, Stock market wealth and the real economy: A local labor market approach, *NBER Working Paper*.
- Cohn, Jonathan B, and Malcolm I Wardlaw, 2016, Financing constraints and workplace safety, *The Journal of Finance* 71, 2017–2058.

- Corradin, Stefano, and Alexander Popov, 2015, House prices, home equity borrowing, and entrepreneurship, *The Review of Financial Studies* 28, 2399–2428.
- Crane, Alan D, Andrew Koch, and Leming Lin, 2019, Real effects of markets on politics: Evidence from US presidential elections, *Available at SSRN 3460209*.
- Crouzet, Nicolas, 2018, Aggregate implications of corporate debt choices, *The Review of Economic Studies* 85, 1635–1682.
- Crouzet, Nicolas, and Fabrice Tourre, 2020, Can the cure kill the patient? corporate credit interventions and debt overhang, *Unpublished Manuscript*, *Northwestern University*.
- Decaire, Paul, and Denis Sosyura, 2020, Ceo pet projects, SSRN Working Paper .
- Denes, Matthew, Sabrina Howell, Filippo Mezzanotti, Xinxin Wang, and Ting Xu, 2020, Investor Tax Credits and Entrepreneurship: Evidence from US States, *Available at SSRN 3596342*.
- Di Maggio, Marco, Amir Kermani, and Kaveh Majlesi, 2020, Stock market returns and consumption, *The Journal of Finance*.
- Døskeland, Trond M, and Hans K Hvide, 2011, Do individual investors have asymmetric information based on work experience?, *The Journal of Finance* 66, 1011–1041.
- Duygan-Bump, Burcu, Alexey Levkov, and Judit Montoriol-Garriga, 2015, Financing constraints and unemployment: Evidence from the Great Recession, *Journal of Monetary Economics* 75, 89–105.
- Ellul, Andrew, Marco Pagano, and Fabiano Schivardi, 2018, Employment and wage insurance within firms: Worldwide evidence, *The Review of Financial Studies* 31, 1298–1340.
- Fagereng, Andreas, and Marius Alexander Kalleberg Ring, 2021, Financial frictions and the non-distortionary effects of delayed taxation, *Available at SSRN 3791384*.
- Fonseca, Julia, and Jialan Wang, 2021, How much do small businesses rely on personal credit, Working Paper.
- Fracassi, Cesare, Mark J Garmaise, Shimon Kogan, and Gabriel Natividad, 2016, Business microloans for us subprime borrowers, *Journal of Financial and Quantitative Analysis* 55–83.
- Friedrich, Benjamin, Lisa Laun, Costas Meghir, and Luigi Pistaferri, 2019, Earnings dynamics and firm-level shocks, Technical report, National Bureau of Economic Research.
- Greenstone, Michael, Alexandre Mas, and Hoai-Luu Nguyen, 2020, Do credit market shocks affect the real economy? Quasi-experimental evidence from the great recession and "normal" economic times, *American Economic Journal: Economic Policy* 12, 200–225.
- Guiso, Luigi, Luigi Pistaferri, and Fabiano Schivardi, 2005, Insurance within the firm, Journal of

- Political Economy 113, 1054–1087.
- Guiso, Luigi, Paola Sapienza, and Luigi Zingales, 2018, Time varying risk aversion, *Journal of Financial Economics* 128, 403–421.
- Hanspal, Tobin, 2018, The effect of personal financing disruptions on entrepreneurship, SAFE Working Paper No. 161.
- Hanspal, Tobin, Annika Weber, and Johannes Wohlfart, 2020, Income and wealth shocks and expectations during the covid-19 pandemic, CEBI Working Paper Series.
- Hanspal, Tobin, Annika Weber, and Johannes Wohlfart, 2021, Exposure to the covid-19 stock market crash and its effect on household expectations, *Review of Economics and Statistics* 103, 994–1010.
- Hurst, Erik, and Annamaria Lusardi, 2004, Liquidity constraints, household wealth, and entrepreneurship, *Journal of Political Economy* 112, 319–347.
- Hvide, Hans K, and Jarle Møen, 2010, Lean and hungry or fat and content? entrepreneurs' wealth and start-up performance, *Management Science* 56, 1242–1258.
- Juelsrud, Ragnar E, and Ella Getz Wold, 2020, Risk-weighted capital requirements and portfolio rebalancing, *Journal of Financial Intermediation* 41, 100806.
- Kaustia, Markku, and Samuli Knüpfer, 2008, Do investors overweight personal experience? Evidence from IPO subscriptions, *The Journal of Finance* 63, 2679–2702.
- Keloharju, Matti, Samuli Knüpfer, and Juhani Linnainmaa, 2012, Do investors buy what they know? product market choices and investment decisions, *The Review of Financial Studies* 25, 2921–2958.
- Kerr, Sari Pekkala, William R Kerr, and Ramana Nanda, 2015, House money and entrepreneurship, Harvard Business School Entrepreneurial Management Working Paper.
- Kerr, William R, Josh Lerner, and Antoinette Schoar, 2014, The consequences of entrepreneurial finance: Evidence from angel financings, *The Review of Financial Studies* 27, 20–55.
- Knüpfer, Samuli, Elias Rantapuska, and Matti Sarvimäki, 2017, Formative experiences and portfolio choice: Evidence from the finnish great depression, *The Journal of Finance* 72, 133–166.
- Kuchler, Theresa, and Basit Zafar, 2019, Personal experiences and expectations about aggregate outcomes, *The Journal of Finance* 74, 2491–2542.
- Laudenbach, Christine, Benjamin Loos, Jenny Pirschel, and Johannes Wohlfart, 2021, The trading response of individual investors to local bankruptcies, *Journal of Financial Economics* 142, 928–953.

- Levine, Ross, and Yona Rubinstein, 2017, Smart and illicit: who becomes an entrepreneur and do they earn more?, The Quarterly Journal of Economics 132, 963–1018.
- Lindsey, Laura Anne, and Luke CD Stein, 2019, Angels, entrepreneurship, and employment dynamics: Evidence from investor accreditation rules, *Available at SSRN 2939994*.
- Malmendier, Ulrike, and Stefan Nagel, 2011, Depression babies: do macroeconomic experiences affect risk taking?, *The Quarterly Journal of Economics* 126, 373–416.
- Meeuwis, Maarten, 2020, Wealth fluctuations and risk preferences: Evidence from us investor portfolios, Available at SSRN 3653324.
- Paravisini, Daniel, Veronica Rappoport, and Enrichetta Ravina, 2017, Risk aversion and wealth: Evidence from person-to-person lending portfolios, *Management Science* 63, 279–297.
- Peter, Alessandra, 2020, Owning up: Closely held firms and wealth inequality, Working Paper.
- Petersen, Mitchell A, and Raghuram G Rajan, 1994, The benefits of lending relationships: Evidence from small business data, *The Journal of Finance* 49, 3–37.
- Pool, Veronika K, Noah Stoffman, Scott E Yonker, and Hanjiang Zhang, 2019, Do shocks to personal wealth affect risk-taking in delegated portfolios?, *The Review of Financial Studies* 32, 1457–1493.
- Popov, Alexander, and Jörg Rocholl, 2018, Do credit shocks affect labor demand? evidence for employment and wages during the financial crisis, *Journal of Financial Intermediation* 36, 16–27.
- Quadrini, Vincenzo, 2000, Entrepreneurship, saving, and social mobility, *Review of Economic Dynamics* 3, 1–40.
- Rajan, Raghuram G, and Luigi Zingales, 1998, Financial dependence and growth, *The American Economic Review* 88, 559–586.
- Ring, Marius A. K., 2020, Wealth taxation and household saving: Evidence from assessment discontinuities in norway, *Working Paper*.
- Risch, Max, 2019, Does taxing business owners affect their employees? evidence from a change in the top marginal tax rate, *Working Paper*.
- Schmalz, Martin C, David A Sraer, and David Thesmar, 2017, Housing collateral and entrepreneurship, *The Journal of Finance* 72, 99–132.
- Sockin, Jason, and Michael Sockin, 2021, Performance pay and risk sharing between firms and workers, *Available at SSRN 3774639*.
- Stiglitz, Joseph E, 1975, The effects of income, wealth, and capital gains taxation on risk-taking,

Stochastic Optimization Models in Finance 291–311.

Sun, Qi, and Mindy Z Xiaolan, 2019, Financing intangible capital, $Journal\ of\ Financial\ Economics$ 133, 564–588.

Townsend, Richard R, 2015, Propagation of financial shocks: The case of venture capital, *Management Science* 61, 2782–2802.

Zator, MICHAL, 2020, Working more to pay the mortgage: Interest rates and labor supply.