# Negative Sentiment and Aggregate Retail Trading: Evidence from Mass Shootings

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#### Abstract

I analyze the role of sentiment in aggregate retail investors' trading activity. Using mass shootings in the U.S. as exogenous, non-economic, and negative shocks to investor sentiment, I find that retail investors on average net sell stocks of firms headquartered in the states where mass shootings took place in the previous week ("local" stocks). Consistent with lower sentiment-driven trading, the retail net divestment from local stocks increases in the number of victims from mass shootings, and is more pronounced following unsolved shootings and shootings with teenage victims. However, such trading behavior does not seem to be rational, as local mass shootings have little impact on local firms' financial and operating performances, as well as local economic conditions. Finally, institutional investors do not react to mass shootings, which suggests that retail investors are more prone to sentiment

#### Motivation

- Retail investors are important participants in the U.S equity market (25% of U.S. equity trading volume)
- Conventional wisdom: retail investors are "noise traders" who are subject to sentiment, whereas institutional investors are sophisticated and rational
- Most studies only focus on asset return implications of sentiment changes, not the actual trading behaviors

#### Research Questions

- What role does sentiment play in aggregate retail investors' daily equity trading decisions and activities?
- 2 Are institutional investors affected by sentiment?

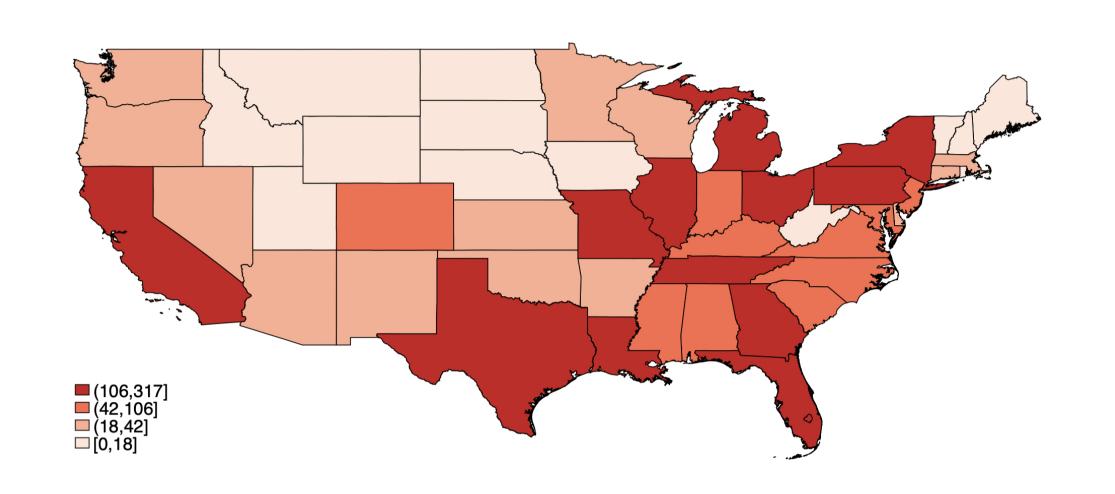
#### Approach

- Apply BJZZ (2021) algorithm to identify a comprehensive set of retail and institutional orders regarding > 3000 public companies in the U.S.
- Use > 3000 mass shootings as proxies for non-economic, salient, exogenous, and negative shocks to investor sentiment

#### Data

- Sample period: 2013-2021
- Daily retail and institutional trading activity: BJZZ (2021) algorithm on sub-penny price improvement in orders from TAQ
- Mass shootings: Gun Violence Archive (GVA). > 3000 shootings in which at least 4 people were injured or killed by the use of firearms
- Stock characteristics: CRSP and Compustat
- State economic conditions: U.S. Bureau of Economic Analysis (BEA)

### Mass Shootings Across U.S. States



# **Empirical Specification**

 $Mroib_{i,s,t} = \alpha + \beta * Shooting_{s,w-1} + Controls + FEs + \epsilon_{i,s,t}$ 

- $Morib_{i,s,t}$ : daily retail order imbalance for stock i in state s on day t: (buy sell) / (buy + sell)
- Shooting<sub>s,w-1</sub>: dummy = 1 if at least one mass shooting occurred in state s during week w-1
- Controls: Stock and state characteristics that affect both retail trading and the likelihood of mass shootings

### Baseline Results

- Google SVI suggests people pay close attention to mass shootings
- Retail investors net sell local stocks after mass shootings

Dep. Var.	Volume Imbalance	Trades Imbalance	
	(1)	(2)	
Shooting	-0.160***	-0.100**	
	[0.058]	[0.039]	
Return	-0.037***	-0.040***	
	[0.003]	[0.003]	
Log_Size	0.294***	0.378***	
	[0.030]	[0.033]	
Controls	Y	Y	
Industry FE	Y	Y	
Year-month FE	Y	Y	
Obs	6396133	6396133	
Adj. $R^2$	0.4%	1.39%	

# Shooting-level Heterogeneity

• Net retail divestment increases following more severe and tragic mass shootings

Dep. Var.	Volume Imbalance	Volume Imbalance
	(1)	(2)
Not_Arrested	-0.196***	
	[0.066]	
Arrested	-0.046	
	[0.069]	
Teen		-0.255***
		[0.065]
Adult		-0.106
		[0.066]
Controls	Y	Y
Industry FE	Y	Y
Year-month FE	Y	Y
Obs	6396133	6396133
$Adj R^2$	0.4%	1.39%

# Retail Investors Rationality

 No significant changes in local stock returns or local firms' operating performances after mass shootings ⇒ retail investors are not rational

	W	w+1	w+2	w+3
	(1)	(2)	(3)	(4)
Shooting	-0.001	-0.004	-0.001	0.002
	[0.003]	[0.004]	[0.004]	[0.004]
Controls	Y	Y	Y	Y
Industry FE	Y	Y	Y	Y
Year-month FE	Y	Y	Y	Y
	Sales/Assets		ROA	
	(1)	(2)	(3)	(4)
Log_Shooting	-0.071		0.122	
	[0.080]		[0.085]	
Log_Victim		-0.021		0.061
		[0.039]		[0.053]
Firm FE	Y	Y	Y	Y
State FE	Y	Y	Y	Y
Industry-Year FE	Y	Y	Y	Y

# Institutional Trading

• Institutional investors exhibit no reactions to the same set of mass shootings

Dep. Var.	Volume Imbalance Trades Imbalance		
	(1)	(2)	
Shooting	0.007	0.015	
	[0.049]	[0.040]	
Return	0.018***	0.018***	
	[0.001]	[0.001]	
Log_Size	0.611***	0.307***	
	[0.025]	[0.016]	
Controls	Y	Y	
Industry FE	Y	Y	
Year-month FE	Y	Y	
Obs	6396133	6396133	
Adj. $R^2$	2.75%	4.74%	