

# Unrealized Trading Gains

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## Abstract

I show that the accounting of unrealized gains and losses affects the elasticity of capital that insurance companies provide to the bond market during crisis periods. This is because insurers face a trade-off between the economic gains from trading on quasi-arbitrage opportunities and the regulatory costs from realizing capital losses otherwise shielded under held-to-maturity accounting. For identification, I compare different insurers' trading decisions on the same bond CUSIP at the same time and find that insurers with more unrealized losses on the bond (the bond's peers) are less elastic to mutual fund flow-induced buying (selling). At the market level, bond groups with larger aggregate unrealized losses across insurers have larger yield sensitivity to mutual fund flow-induced liquidity shocks. Using this trade-off, I quantify the economic price of regulatory capital during crisis periods, which is \$0.81 on average and significantly higher for capital-constrained insurers.

Keywords: unrealized gains and losses, held-to-maturity accounting, market elasticity, slow-moving capital, flow-induced trading

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# 1 Introduction

The corporate bond market can be fragile against liquidity shocks. For example, during the onset of COVID crisis in March 2020, there were large outflows from bond mutual funds, which led to flow-induced fire sales and widespread bond mispricings (Vissing-Jorgensen, 2021; Haddad et al., 2021; Ma et al., 2022). A key question is why was there a lack of elastic capital that would have traded against these liquidity shocks. In the language of Duffie (2010), why was arbitrage capital so slow-moving? In particular, insurance companies, the largest holders of corporate bonds, were uniquely positioned to act on trading opportunities due to stable funding structure (Coppola, 2022; O'Hara et al., 2024). In this paper, I show that unrealized gains and losses can reduce the elasticity of capital that insurers and other investors subject to held-to-maturity accounting rationally provide to the bond market.

The main insight is that there can be regulatory costs associated with trading gains, due to the realization of investment losses otherwise shielded under held-to-maturity accounting. Consider a bond being fire-sold by mutual funds experiencing outflows. It would be profitable to purchase this bond at a discount, and one way to finance this purchase is by selling some existing holdings of bonds, ideally bonds with very similar characteristics (e.g. same rating and duration) so that there is minimal portfolio distortion. This bond swap would lead to a gain equal to the current price differential of the two bonds, which will gradually realize over time. However, if there are large unrealized losses on existing bond holdings, selling would trigger the recognition of those losses otherwise shielded under held-to-maturity accounting, leading to a temporary reduction in regulatory capital (ELLUL et al., 2015).

I have three findings, focusing on insurance companies during crisis periods. First, insurers with more unrealized losses on the relevant positions are less responsive to trading opportunities arising from mutual fund flow-induced liquidity shocks. Importantly, this finding holds true when I compare different insurers' actions on the same bond at the same time, which

purges out any bond-level confounders (e.g. momentum). Second, at the market level, bond groups with larger aggregate unrealized losses across insurers are more sensitive to liquidity shocks, consistent with the lack of elastic capital from insurers. Lastly, this trade-off between trading gains and loss realization presents a unique opportunity to quantify the economic price of regulatory capital, which I estimate to be \$0.81 on average and significantly higher for capital-constrained insurers.

I start by describing the relevant accounting rules on investment gains and losses for insurance companies. Insurers report holdings of investment-grade debt securities on a held-to-maturity (HTM) basis, as opposed to mark-to-market (MTM). This means that, as long as the bond is not traded, moderate appreciation or depreciation in its market value does not affect its book value. When the insurer sells the bond, however, any gains and losses accumulated since its purchase are realized and recognized on the insurer's balance sheet. Depending on the size of accumulated gains and losses, trading can therefore trigger large increase or decrease in the insurer's capital. One thing to emphasize is that realization of gains and losses only affects the insurer's *regulatory* capital, while the true *economic* capital should have factored in any gains and losses as soon as they emerge in the first place.

Due to this accounting treatment, insurers must additionally consider the impact on regulatory capital when deciding whether to act on trading opportunities. When a bond is over-priced, for example due to mutual fund inflow-induced buying, the insurer may be reluctant to sell, if it has accumulated large unrealized loss on that bond. When a bond is under-priced, on the other hand, the relevant state variable is unrealized losses on other similar bonds that the insurer can sell in order to buy the under-priced bond.

I study how insurers respond to trading opportunities during the Great Financial Crisis (GFC) in 2007-2009 and the COVID crisis in 2020. Insurers' regulatory capital is particularly constrained during these crisis periods due to large drops in asset values (which decrease capital), widespread rating downgrades (which increase *required* capital), and large increases

in the moneyness of variable annuity guarantees (which decrease capital). These periods also coincide with the largest mutual fund flow-induced liquidity shocks and a dwindling of arbitrage capital elsewhere (e.g. dealer inventory), so that the elasticity of insurer capital becomes particularly important.

In the cross section of bonds, the prices of those with more aggregate unrealized losses on insurers' books are much more sensitive to liquidity shocks, measured by mutual fund flow-induced trading (FIT). Consistent with existing literature, higher inflow-induced purchases (outflow-induced sales) lead to lower (higher) bond yield. This yield sensitivity to FIT is significantly amplified for bonds with higher unrealized losses across insurers. Importantly, the bond's *own* unrealized losses affect its price sensitivity to inflow-induced purchases, whereas the bond's *peer* unrealized losses affect its price sensitivity to outflow-induced sales, consistent with my hypothesis. The price effects revert over time, confirming the interpretation of FIT as liquidity shocks that are orthogonal to firm fundamentals. The results are robust to including granular rating-by-duration-by-industry-by-time fixed effects and measuring mispricings through CDS basis.

I examine insurers' trading activities to sharpen the causal interpretation. Consistent with the pricing results, insurers are less likely to respond to trading opportunities that require the realization of more accounting losses. On average, insurers are sensitive to trading opportunities, decreasing (increasing) holdings of the bond that experiences inflow-induced purchases (outflow-induced sales). However, this sensitivity to FIT is significantly dampened when there is higher unrealized loss. Consistent with my hypothesis, *own* (*peer*) unrealized losses are the relevant dampener for positive (negative) FIT. Importantly, these results hold when I control for bond-by-time fixed effects – effectively, I compare different insurers' trading of the same bond CUSIP at the same time, further pinpointing the role of unrealized loss.

This trade-off between trading gains and regulatory costs provides a unique setting to quantify the economic price of regulatory capital. To do this, I use machine learning methods

to identify the indifference line that equalizes trading gains and regulatory capital losses, revealed by each insurer’s trading decisions. This indifference line shows the average cost of trading (the intercept) and the compensation required to lose each unit of regulatory capital (the slope), which average at \$3.31 and \$0.81, respectively. There is considerable variation in the price of regulatory capital across insurers. A panel regression suggests that, when regulatory capital is more scarce (e.g. RBC ratio is lower), its economic price is higher.

## 1.1 Literature

This paper contributes to the understanding of bond market elasticity. Papers such as [Bretscher et al. \(2021\)](#), [Ma et al. \(2022\)](#) and [Chaudhary et al. \(2022\)](#) focus on measuring the *magnitude* of bond market elasticity. Consistent with these papers, I show that market elasticity is limited, even for bonds that are highly substitutable to each. The common narratives attribute this inelasticity to inattention or trading frictions, and simply label inelastic investors as “buy-and-hold” or “preferred habitat” investors. This paper offers a rational explanation: investors subject to held-to-maturity accounting can be inelastic on the positions that have accumulated large unrealized losses for fear of incurring regulatory capital reductions.

This paper contributes to the understanding of insurance companies’ trading behavior ([ELLUL et al., 2015](#); [Ozdagli and Wang, 2019](#); [Ge and Weisbach, 2021](#)). The most related paper is [ELLUL et al. \(2015\)](#), who show that insurers subject to held-to-maturity accounting are incentivized to realize investment gains in order to make up the loss of regulatory capital due to ABS downgrades. Building on this insight, I show that unrealized losses disincentivize insurers to react to trading opportunities. Although both of our papers are about distortion of trading behavior, whereas they focus on the unconditional incentive to trade, I focus on the *disincentive* to trade conditional on trading opportunities.<sup>1</sup> More importantly, I use the

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<sup>1</sup>[Fuster et al. \(2024\)](#) shows that banks reduce duration rebalancing related to realize losses on underwater

trade-off with trading gains as a unique setting to quantify the price of regulatory capital across insurers.

This paper contributes to the literature on the trade-off between economic versus regulatory gains faced by financial intermediaries. Mostly related are [Kojen and Yogo \(2015\)](#), [Ge \(2022\)](#) and [Sen \(2023\)](#), which also focus on insurance companies and study economic gains and losses from selling insurance products or hedging. This paper presents a new method to measure the economic value of regulatory capital, namely by identifying the indifference line that equates the loss of regulatory capital with the gains from trading against mutual fund flow-induced liquidity shocks.

## 2 Background and Data

### 2.1 Insurers' capital accounting

The law of motion for insurers' regulatory capital (see [Figure A2](#) for an example) can be summarized by the following equation:

$$Capital_{i,t} = Capital_{i,t-1} + UnderwritingIncome_{i,t} + InvestmentIncome_{i,t} + Financing_{i,t} \tag{1}$$

Underwriting income includes premiums collected, claims paid, and, importantly, changes in life insurance reserves, where a key driver is the moneyness of variable annuity guarantees ([Kojen and Yogo, 2022](#)). Investment income includes distributions such as coupons and dividends and investment gains and losses, which are further divided into ones that are realized (for assets sold) and ones that are not (for all remaining assets). Financing includes new capital raised. If, for example, the insurer incurs large increase in reserves from its 

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held-to-maturity securities.

variable annuity business, its regulatory capital would decrease, unless it can, for example, obtain large realized investment gains from some asset sales.

Unrealized gains and losses are governed by held-to-maturity accounting for investment-grade debt securities (NAIC 1 and 2), which account for 90% of insurers' holdings.<sup>2</sup> Under held-to-maturity accounting, the value of a bond follows a linear interpolation between its historical cost at acquisition and its par value at maturity. Therefore, if the market value of the bond drops temporarily (e.g. due to monetary policy rate hikes), its accounting value would not be affected. This way there is much more stability for insurers' regulatory capital, in terms of accounting. However, if it sells the bond, the insurer needs to reset the bond's book value to its trading value, thereby recognizing all *cumulative* gains or losses previously shielded under held-to-maturity accounting.<sup>3</sup> Figure A1 illustrates this accounting treatment.

Life insurance companies are further required to amortize realized gains and losses over the remaining life of the bond sold. This rule, called interest maintenance reserve (IMR), reduces the (dis)incentive to realize gains and losses. Nonetheless, Eastman et al. (2024) show that life insurers, particularly the ones experiencing the tail end of underwriting and hence capital losses, time the realization of gains and losses. I will show that the trading behavior that I document applies less to life insurers (albeit still significant) than to P&C insurers, where IMR does not apply.

Equation 1 shows that the realization of gains and losses simultaneously affects income and capital. Existing literature has shown strategic realization of gains and losses related to both income smoothing (e.g. Barth et al., 2017) and capital smoothing (e.g. ELLUL et al., 2015). My main results do not depend on whether insurance companies intend to smooth income or smooth capital, but I will provide evidence that differentiates the two mechanisms whenever

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<sup>2</sup>Mark-to-market accounting is required for securities that are in or near default (NAIC 6) for life insurers and for all non-investment-grade securities (NAIC 3, 4, 5 and 6) for P&C insurers.

<sup>3</sup>Insurers also need to recognize unrealized losses for other than temporary impairment (OTTI), which is defined for bonds that drop from investment grade to below investment grade.

possible (e.g. compare insurers with similar income but different capital).

Taxes on realized gains and losses can affect trading. [Jin \(2006\)](#) shows that investors are incentivized to delay the realization of capital gain taxes. However, this tax incentive is overpowered by the regulatory capital incentive during crisis periods ([ELLUL et al., 2015](#)), which are what I focus on. Moreover, as opposed to individual capital gain tax rate [Poterba and Weisbenner \(2001\)](#), corporate tax rate is invariant to the level of income or the length of holding, so tax incentives are less for c-corporations, where insurance companies are categorized.

## 2.2 Insurers' response to trading opportunities

There are three ways that insurance companies can respond to trading opportunities, such as mutual fund flow-induced mispricings during the onset of COVID in March 2020. Firstly, insurers can draw down holdings of cash and cash equivalents. Insurers held \$233 billion of cash as of year-start 2020 and actually *increased* cash holding during 2020Q1, possibly to fulfill liquidity regulations or to guard against future liquidity shocks. Secondly, insurers can trade with new capital. During 2020Q1, insurers' operating cash flow was \$60 billion, including \$65 billion of investment income, so insurers' cash flow from non-investment operations was actually negative. Lastly, insurers can trade with existing capital, meaning that they can sell old bonds to buy new bonds that are mispriced. Insurers had \$4,305 billion of bond holdings entering 2020 and sold \$103 billion bonds on the secondary market during March 2020. Therefore, trading with existing capital seems to be a viable method for insurance companies, and the question is why didn't they do more.

Due to the favorable regulatory treatment of unrealized loss under held-to-maturity accounting, there is a trade-off that insurance companies face when deciding whether to take advantage of a trading opportunity. Panel A of [Figure 1](#) illustrates with an example. In



the left panel, there are two bonds A and B with identical cash flows (periodic coupons and redemption at T2), their prices both decline at T1 (e.g. during monetary tightening cycle), and Bond A has larger price discount compared to Bond B due to liquidity shocks (e.g. mutual fund outflow-induced fire sales). Any investor would have an incentive to simultaneously sell Bond B and buy Bond A, which would yield an immediate gain while leaving future cash flows intact. However, because both bonds have large unrealized losses, selling Bond B would incur a temporary reduction in regulatory capital, as illustrated in the right panel. The blue bars show that, if the insurer does not trade, its book value would gradually increase from historical cost at T0 to par value at T2 plus periodic coupon payments. The orange bars show that, if it does trade, its book value would drop initially because of the realization of market-wide loss, but it will eventually end up higher because of the trading gains.

When a bond is over-priced, for example due to mutual fund inflow-induced buying, the insurer may decide not to sell if it has accumulated large unrealized loss on that bond. When a bond is under-priced, on the other hand, the relevant state variable is unrealized losses on other bonds that the insurer can sell in order to buy the under-priced bond.

## 2.3 Sample selection

I focus on the crisis periods during December 2007 to June 2009 (the great financial crisis (GFC)) and February 2020 to April 2020 (the COVID). These crisis periods are when insurers' regulatory capital is particularly constrained, due to large drops in asset value (which decrease capital), widespread rating downgrades (which increase required capital), and large increases in the moneyness of variable annuity guarantees (which decrease capital). Figure [A3](#) shows aggregate changes in regulatory capital (Equation 1) due to underwriting income and investment income, but excluding realized gains and losses. This graph shows large

negative capital losses during crisis periods, which create strong incentives (disincentives) for insurers to realize gains (losses).

The crisis periods also coincide with the largest mutual fund flow-induced trading activities, detailed below and shown in Figure A4. At the start of crises, bond mutual funds tend to experience large outflows, as liquidity shocks emerge and get amplified by strategic complementarity (Goldstein et al., 2017; Falato et al., 2021). Announcement of policies such as QE and PMCCF/SMCCF tends to quickly restore market liquidity and lead to large mutual fund inflows. During crises, there tends to be a dwindling of arbitrage capital – for example, dealers tend to take less inventory risk as regulatory constraints tighten during crisis (Dick-Nielsen and Rossi, 2018). These stylized facts – that there are more mutual fund flow-induced liquidity shocks and there is less arbitrage capital – makes the elasticity of insurer capital particularly important during crisis periods.

## 2.4 Data and variables

U.S. insurers report detailed security-level holdings under Schedule D Part 1 of annual filings to the National Association of Insurance Commissioners (NAIC). In particular, these reports contain book value and fair value for each security. The sum of security-level book values is required to match with the total book value on headline balance sheet pages, assuring data accuracy. Fair value is assessed by individual insurers, which can be manipulated (Sen and Sharma, 2022), so I will use month-end trading price from TRACE, defined as weighted average of trade prices across trades in the last 5 days of the month. Insurance companies also report transactions under Schedule D Part 3 (purchases) and Part 4 (sales), which I use to construct security-level holdings and book value at the monthly frequency.<sup>4</sup> Figure A2 shows a sample of these data reported by insurers.

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<sup>4</sup>For bonds that are traded during the year, their book values are reported in the transaction filings. Bonds that are not traded are not reported in the transaction filings, and I infer their book value by interpolating the book values over the previous and the subsequent annual filings on holdings.

The amount of unrealized loss that is not recognized under held-to-maturity accounting is defined as the difference between book value and market value:

$$UnrealizedLoss_{i,b,t}^{\$} = BookValue_{i,b,t} - MarketValue_{b,t} \quad (2)$$

I will compare the amount of unrealized loss to either the amount of holdings by individual insurers or the total amount of bond outstanding in the market.

I focus on liquidity shocks coming from mutual fund flow-induced trading (Lou, 2012; Chaudhary et al., 2022). Mutual fund data (e.g. holdings) are from Morningstar Direct. I filter for mutual funds that focus on U.S. fixed income assets through Base Currency and Global Broad Category Group. Mutual fund flow-induced trading is measured at the bond issuer level:

$$FlowInducedTrading_{j,t} = \frac{\sum_i AmountHeld_{i,j,t-1} Flow_{i,t}^{\%}}{AmountOutstanding_{j,t-1}} \quad (3)$$

where  $AmountHeld_{i,j,t-1}$  denotes amount of issuer  $j$ 's bonds held by fund  $i$  in the previous month,  $AmountOutstanding_{j,t}$  total amount of issuer  $j$ 's bonds outstanding, and  $Flow_{i,t}^{\%}$  net flows to fund  $i$  in the current period (relative to lagged fund size). Intuitively, FIT measures the amount of net purchase of issuer  $j$ 's bonds if its existing fund holders simply scale up or down their portfolios in response to flows. This proportional scaling behavior has been documented in Choi et al. (2020); Ma et al. (2022); Fang (2023). I focus on FIT at the issuer level, because funds tend to buy bonds from the same issuers, even though not necessarily the exact same bonds (Fang, 2023).

FIT are analogous to shift-share instruments and therefore can be treated as liquidity shocks that are orthogonal to firm fundamentals (Chaudhary et al., 2022; Fang, 2023). It is easy to draw a comparison with the canonical shift-share instrument for local employment growth (Goldsmith-Pinkham et al., 2020). In the canonical setting, there are several industries, different counties are differentially exposed to these industries, and shocks to an industry

disproportionately affects the counties that have higher ex ante exposure to that industry. In my setting, there are many bond funds, different firms are differentially exposed to these bond funds, and flows to a bond fund disproportionately affects the firms that have higher ex ante exposure to that fund, i.e. higher ex ante ownership by that fund.

Data on corporate bonds are from FISD (for characteristics) and TRACE (for prices). I focus on straight senior unsecured U.S.dollar bonds issued by non-financial U.S. firms.<sup>5</sup> I focus on investment-grade bonds, as this market is where insurance companies primarily invest and face relatively fewer regulatory restrictions. I use the bond-Compustat link by [Fang \(2023\)](#) to map bonds to ultimate issuing entities. Cleaning of TRACE data follows [Dick-Nielsen \(2014\)](#).

Data on CDS are from Markit and linked to Compustat firms through issuer CUSIP and ticker. For a given bond, the CDS basis is:

$$CDSBasis = YieldSpread - CDS Spread \tag{4}$$

where yield spread is spread over duration-matched Treasury yield and CDS spread is par spread on 5-year CDS contract. To ensure the comparability of tenor, I restrict to bonds that are within 3 to 7 years to maturity.

### 3 Unrealized Loss and Insurer Elasticity

In this section, I show that, during crisis periods, insurers trade less against liquidity shocks when facing higher unrealized losses. A key advantage of looking at insurer trading is that I can compare the actions by different insurers with different unrealized losses on the same

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<sup>5</sup>A bond is commonly defined as straight if it has fixed coupon, bullet maturity, not convertible, not exchangeable, not fixed callable, not puttable.

bond CUSIP at the same time. This would rule out any unobserved effects at the bond level, such as correlated buying or selling by all insurers due to momentum or reversal (Jostova et al., 2013), and more convincingly attribute any differences in trading behavior to differences in unrealized losses.

I run the following regression on a three-dimensional panel data, where each observation corresponds to insurer  $i$ 's trading of investment-grade bond  $b$  in month  $t$ :

$$\Delta Holding_{i,b,t} = \beta FlowInducedTrading_{b,t} \times UnrealizedLoss_{i,b,t-1} + \gamma Controls + FE + \epsilon_{i,b,t} \quad (5)$$

$\Delta Holding_{i,b,t}$  denotes change in insurer  $i$ 's par amount held of bond  $b$  over month  $t$ , scaled by lagged par amount held. Mutual fund flow-induced trading is defined in Equation 3 and serves as a proxy for liquidity shock.  $UnrealizedLoss_{i,b,t-1}$  denotes insurer  $i$ 's own (peer) unrealized loss (negative for unrealized gain) on bond  $b$  (bond  $b$ 's peers) relative to par amount held, measured as of the previous month. To ease interpretation,  $UnrealizedLoss$  is scaled to mean zero and unit standard deviation.

I control for bond characteristics, including credit rating, years to maturity, coupon rate, log amount outstanding and bid-ask spread. This purges out common trading across insurers driven by observable bond characteristics (e.g. low credit rating). I include insurer by time fixed effects, which further purge out unobserved common trading across bonds by a given insurer at a given time (e.g. due to high insurance sales). In the baseline regression, I also include bond peer group by time fixed effects, where a bond peer group is identified by bonds with the same credit rating letter, same years to maturity, same rounded coupon rate, and same Fama-French 12 industry. This purges out unobserved common trading across insurers by a given type of bond at a given time.

The results are given in Table 1. For illustration, Panel A first focuses on the *cross section* of insurers and their trading of different bonds in the single month of March 2020, when

COVID started. As previously shown in Figure A4, FIT is negative for almost all bonds in March 2020 due to large outflows that were common across bond mutual funds (Falato et al., 2021). Column 1 shows a statistically significant negative relationship between insurer trading and FIT: 1% mutual fund flow-induced selling ( $FIT = -1$ ) leads to net purchase by the average insurance company equal to 0.243% of original holdings. Together with the price impact results that will be shown in the next section, this implies that insurers' price elasticity of demand is around 0.08. The elasticity estimate is lower than those in Bretscher et al. (2021); Chaudhary et al. (2022); Fang and Xiao (2024) that include non-crisis periods, suggesting that elastic capital is particularly scarce during crisis periods Duffie (2010).

Column 2 adds interactions between flow-induced trading and unrealized losses. The interaction between FIT and *peer* unrealized loss is significant and positive. This means that, conditional on -1% flow-induced trading, purchases by insurers are 0.294% smaller if the bond's peers carry one-standard-deviation higher unrealized losses. This is consistent with the interpretation that, when there are large outflow-induced sales by mutual funds, insurers buy, but the buying is dampened if there is large unrealized loss on the peer bond. Note that controlling for the interaction with unrealized losses boosts the baseline effect of FIT on insurer trading from -0.243% to -0.373%. Importantly, the interaction between FIT and the bond's *own* realized losses is not significant, consistent with my hypothesis in Section 2.2.

Column 3 includes bond CUSIP fixed effects, so the regression is identified by different trading actions on the same bond by different insurers that face different unrealized losses. How can two insurers have different unrealized losses on the same bond at the same time? This is because of the different timing of their purchases. For example, one insurer may have purchased the bond at its issuance, whereas the other insurer may have purchased the bond on the secondary market several years after it has been issued, in response to large inflows of insurance premiums and lack of primary market issuances that month. The price of this bond

might have decreased substantially during this gap (e.g. due to tightening monetary policy), leading to larger unrealized loss for the first insurer. The timing of these historical purchases is likely orthogonal to subsequent mutual fund flow-induced trading, providing exogenous variation in unrealized loss across insurers. The results show that my main results continue to hold: insurers are less likely to respond to mutual fund flow-induced fire sales if there are more unrealized losses on the bond's peers.

Panel B of Table 1 extends the analysis from the cross section in March 2020 to all crisis periods during 2007-2009 and 2020. I partition FIT into its negative part and its positive part:  $NegativeFIT = \min(FIT, 0)$  and  $PositiveFIT = \max(FIT, 0)$ . Column 1 shows that there is a negative relationship between insurer trading and mutual fund flow-induced trading. When there are more outflow-induced sales (inflow-induced purchases) by mutual funds, insurers buy more (sell more). Specifically, -1% FIT (+1% FIT) leads to 0.169% increase (0.114% decrease) in holding. Perhaps surprisingly, insurers acted as liquidity providers during crisis periods (O'Hara et al., 2024).

Column 2 adds interactions between flow-induced trading and unrealized loss. The coefficient on the interaction between positive FIT and own unrealized loss is significantly positive, meaning that big unrealized loss dampens the positive relationship between insurer trading and positive FIT. When there are large inflow-induced purchases by mutual funds, insurers sell, but the selling is dampened if there is large unrealized loss on the bond. This dampening pattern is similarly observed for negative FIT and peer unrealized loss, as previously explained in Panel A. The fact that only own unrealized loss (peer unrealized loss) matters for positive FIT (negative FIT) is consistent with my hypothesis.

Column 3 adds bond-by-time fixed effects. As explained before, the regression is now identified by different unrealized losses on the same bond at the same time due to the timing of their purchases by different insurers in history, which are plausible exogenous to subsequent FIT and insurer trading. The regression results remain robust: higher peer (own) unrealized

loss is associated with less buying (selling) against liquidity sales (purchases).

To further understand the underlying mechanism, I add a triple interaction with an dummy variable that indicates whether the insurer has had large capital drawdown. Capital drawdown is defined as cumulative change in regulatory capital since the beginning of crisis (2007Q4 for GFC and 2019Q4 for COVID), excluding new issuance of capital and excluding realized gains and losses, which I have shown can be used to strategically replenish capital. A capital drawdown is defined large if it is more than -20%. Column 4 shows that the triple interaction terms are significant, whereas the double interaction terms decrease substantially in magnitude, suggesting that the effect of unrealized loss primarily comes from insurers with large capital drawdowns. This further confirms the interpretation that the disincentive to trade against liquidity shocks derives from the reluctance to realize losses of regulatory capital.

## 4 Unrealized Loss and Market Elasticity

The previous section shows that insurers are less likely to trade against liquidity shocks on bonds associated with higher unrealized losses. Given the importance of insurers in the corporate bond market, it is natural to expect that this trading behavior should affect market prices.<sup>6</sup> Indeed, this section will show that, during crisis periods and across corporate bonds, those with larger unrealized losses across insurer holders are associated with larger price sensitivity to liquidity shocks, consistent with the lack of elastic insurer capital.

I run the following regression on a sample of investment-grade corporate bonds during crises

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<sup>6</sup>According to Financial Accounts of the United States (L.213), insurance companies have always been the largest holders of corporate and foreign bonds, although the lead against the second biggest holders (mutual funds) has narrowed.



periods:

$$\Delta YieldSpread_{b,t} = \beta FlowInducedTrading_{b,t} \times UnrealizedLoss_{b,t-1} + \gamma Controls + FE + \epsilon_{b,t} \quad (6)$$

$\Delta YieldSpread_{b,t}$  measures the change of bond  $b$ 's yield spread (defined as the bond's yield over that of a duration-matched Treasury bond) over month  $t$ . Mutual fund flow-induced trading (FIT) are defined in Equation 3 and serve as proxy for liquidity shocks. *UnrealizedLoss* is the sum of unrealized losses (negative for unrealized gains) across insurance companies that are not recognized under held-to-maturity accounting, scaled by bond amount outstanding. To ease interpretation, I standardize *UnrealizedLoss* to mean zero and unit standard deviation.

I control for a wide set of observables at  $t - 1$ . I control for the level and the past trajectory of yields, as momentum and reversal can play a role. I also control for credit rating, duration, amount outstanding (log) and trading volume (log). These controls help to parametrically purge out characteristics-driven returns. For example, during crises, bonds with lower credit ratings tend to experience larger yield increases.

I include rating letter (e.g. BBB) by rounded duration (e.g. 8Y) by Fama-French 12 industry by time fixed effects. Effectively, I compare the prices of near-identical bonds with the same rating, same duration, issued by firms in the same industry at the same time.

The results are given in Table 2. For illustration, I start with the *cross section* of bonds during the onset of COVID crisis in March 2020, shown in Panel A. As previously shown in Figure A4, FIT is negative for almost all bonds in March 2020 due to large outflows that were common across bond mutual funds (Falato et al., 2021). Column 1 shows that the coefficient on FIT is significant and negative at -0.747, meaning that, for higher flow-induced selling at 1% of amount outstanding ( $FIT = -1$ ), the bond's yield spread increases by 0.747 percentage point. These results echo the existing evidence that mutual fund flow-induced

liquidity shocks have large price impacts (Lou, 2012; Chaudhary et al., 2022), particularly during crisis periods when arbitrage capital is scarce (Ma et al., 2022; Coppola, 2022).

Column 2 adds the interaction between FIT and unrealized losses. The baseline effect of FIT on bond yield is significantly dampened, from -0.747 in Column 1 to -0.406, which suggests that unrealized loss explains a large portion of the unconditional price impact. The coefficient on the interaction between FIT and peer unrealized loss is significant and negative, meaning that, when there are more unrealized losses on the bond's peers, the negative impact of FIT on bond yield is amplified. The coefficient is economically significant: one-standard-deviation higher peer unrealized loss increases the baseline effect of -0.406 by -0.420, or -103%.

The fact that the bond's own unrealized loss does not have statistically important effect confirms my hypothesis. When a bond is under-priced due to negative liquidity shocks, insurers can gain by selling other bonds – in particularly peer bonds that share similar exposure to future risks as the target bond – and buying the target bond, but they would be discouraged from doing so if there are large regulatory costs associated with recognizing the unrealized losses on those peer bonds.

Column 3 and 4 repeat the same analyses but using CDS basis, i.e. the deviation of yield spread from CDS spread (Equation 4). CDS basis is more likely to reflect mispricing, as the subtraction of CDS spread purges out differences in fundamental default risk. Despite the drop in number of observations, the two main results hold: FIT has price impact, which is amplified by the size of (peer) unrealized loss.

Panel B of Table 2 extends the analysis from the cross section in March 2020 to all crisis periods during 2007-2009 and 2020. Column 1 shows that the coefficients on both the positive part and the negative part of FIT are significant and negative, meaning that more inflow-induced purchases are associated with lower yield spreads and more outflow-induced sales (more negative the term is) are associated with higher yields. Measuring FIT at the issuer-

level is important here, as mutual funds tend to buy bonds from the same firms in response to inflows, but not necessarily the exact same bonds they already hold (Fang, 2023).

Column 2 adds interactions between FIT and unrealized losses. Consistent with my hypotheses, own unrealized loss affects the price impact of positive FIT, while peer unrealized loss affects the price impact of negative FIT. When there is large own unrealized loss, insurers are reluctant to sell the bond, so inflow-induced purchases need to bid for higher prices (lower yields) in order for insurers to sell. When there is large peer unrealized loss, insurers are reluctant to sell peer bonds, so outflow-induced purchases need ask for lower prices (higher yields) in order for insurers to sell other bonds and buy the target bond. The effects are economically large, as one-standard-deviation higher own unrealized loss (peer unrealized loss) amplifies the baseline effect of negative FIT of -0.829 p.p. (positive FIT of -0.055 p.p.) by -0.280 p.p. (-0.121 p.p.), or -33% (-2200%).

Figure 2 shows the full trajectory of yield changes in response to FIT. The two red lines show yield changes in response to outflow-induced selling ( $FIT = -1$ ), whereas the two blue lines show yield changes in response to inflow-induced buying ( $FIT = +1$ ). The dark red (blue) dash line shows cumulative price impacts for the average bond, i.e. where unrealized loss is at its mean. The light red (blue) solid line shows price impact for bonds with one-standard-deviation higher peer unrealized loss (own unrealized loss), which are noticeably larger. Moreover, all yield impacts fully revert over the subsequent months, which confirms that the liquidity shocks are orthogonal to changes in firm fundamentals (e.g. default risk), which would have led to permanent yield changes.

## 5 The Economic Price of Regulatory Capital

I have demonstrated the trade-off that insurers may face between seizing economic gains from trading opportunities and losing regulatory capital from realizing losses otherwise shielded under held-to-maturity accounting. I now show that this trade-off reveals an insurer's valuation of its regulatory accounting capital. For each given value of regulatory capital loss realization, there should be a threshold above which the economic gain from trading is more appealing. With sufficient variation in trading gains and regulatory costs in the cross section of bonds, we can identify this threshold from the insurer's trading decisions.

Panel B of Figure 1 illustrates this strategy. For a given insurer at a given time, each bond can be mapped to this two-dimensional space, with liquidity-shock-implied trading gains on the y-axis and unrealized-loss-implied regulatory capital loss on the x-axis. The top-left green cross should be worthy of trading, as the economic gain is really high and the regulatory cost is actually negative – the position has large unrealized gains and recognizing the gains would increase the insurer's capital. In contrast, the bottom-right red cross is not worthy of trading, as it has little economic gain and simultaneously large regulatory capital loss that would be realized upon trading.

Conditional on having sufficient number of bonds that span this two-dimensional space of trading gain and unrealized loss, we can observe which area is considered profitable and which area is not, given by the green area and the red area, respectively. The curve that separates the green area and the red area tells us that, for these positions, insurers are indifferent between the economic gains and the regulatory costs. The slope of this indifference curve identifies the economic price of regulatory accounting capital: how many units of economic gains are required in order to keep the insurer indifferent, per unit of decrease in regulatory capital due to the recognition of unrealized loss.

I will model this difference curve as a linear line:

$$TradingGain = \tilde{\alpha} + \tilde{\beta}RegulatoryCost \quad (7)$$

Trading gain is measured as mispricing (in percentage point) due to mutual fund flow-induced trading:

$$TradingGain = 0.829 \times PositiveFIT \times Duration - 0.055 \times NegativeFIT \times Duration$$

where 0.829 and 0.055 are from Table 2. Regulatory cost is own (peer) unrealized loss, in percent of holding, in the case of inflow-induced over-pricing (outflow-induced under-pricing):

$$RegulatoryCost = \begin{cases} OwnUnrealizedLoss & FIT > 0 \\ PeerUnrealizedLoss & FIT < 0 \end{cases}$$

Unrealized gain is expressed as negative unrealized loss. In other words, *TradingGain* and *RegulatoryCost* respectively measure the arbitrage gains and the regulatory capital losses that the insurer would get by executing a \$100 trade against FIT.

I want to find the linear classifier that best separates the insurer's bond positions into two groups, one group where the insurer trades and the other where the insurer does not trade, depending on the associated trading gains and regulatory capital losses. To this end, I use a machine learning method called Support Vector Machine (SVM). Standard SVM models the separating line as:

$$w_1x + w_2y - b = 0 \quad (8)$$

where  $x$  and  $y$  denote regulatory cost and trading gain, respectively.  $\tilde{\alpha}$  and  $\tilde{\beta}$  can be recovered

as  $\tilde{\alpha} = \frac{b}{w_1}$  and  $\tilde{\beta} = -\frac{w_1}{w_2}$ . SVM solves the following minimization problem:

$$\min_{w_1, w_2, b} \frac{1}{N} \sum_{i=1}^N \max(0, 1 - z_i(w_1 x_i + w_2 y_i - b)) + \lambda \sqrt{w_1^2 + w_2^2}$$

$z_i$  is an indicator variable of whether the insurer trades on the bond or not. The first term captures the number of misclassifications, the second term captures the width of the soft margin which affects the number of misclassifications, and  $\lambda$  controls the relative weight of these two quantities, both of which SVM seeks to minimize. Figure A5 gives a graphical illustration of the method.

This estimation is done using the cross section of bonds for each insurer at each month-end. Some small insurers do not hold enough bonds to cover sufficient range of trading gain or regulatory cost. Therefore, I group insurers by filer type (life vs P&C) and by size percentile.

Panel C of Table A1 shows the distributions of  $\tilde{\alpha}$  and  $\tilde{\beta}$ . On average,  $\tilde{\alpha}$  is estimated to be \$3.31. This means that, even when there is zero regulatory cost, the threshold at which insurers start responding to trading gains is \$3.31. This is much larger than the average bid-ask spread of corporate bond (\$0.50 per \$100 of trading) and suggests that there are large trading frictions (e.g. inattention) that are not explained by transaction costs or unrealized loss.

On average,  $\tilde{\beta}$  is estimated to be \$0.81. This means that, when there is \$1 higher regulatory cost, the trading gains required is \$0.81. In other words, the economic price of \$1 of regulatory capital is \$0.81. This number is lower than the shadow cost of capital identified in Kojien and Yogo (2015) at \$0.96, partially because the trade-off arising from trading opportunities is less persistent than the trade-off from mispricing insurance products.

What determines the economic price of regulatory capital? To answer this, I examine the

variation in  $\tilde{\beta}$  in a panel regression of insurers  $i$  over quarters  $t$ :

$$\tilde{\beta}_{i,t} = a + b\text{InsurerChar}_{i,t} + e_{i,t} \quad (9)$$

where  $X$  includes RBC ratio and log total assets. Table 3 shows the regression results. The coefficient on RBC ratio is significant and negative, meaning that -1 (-100 percentage point) RBC ratio is associated with \$0.09-\$0.11 increase in the price of regulatory capital. This is consistent with the theoretical models from [Kojien and Yogo \(2015\)](#): when insurers have lower RBC ratio and are closer to regulatory constraint, they put more value in the marginal unit capital.

## 6 Conclusion

This paper identifies the accounting treatment of unrealized investment gains and losses as an important determinant of bond market efficiency. Due to the favorable treatment of unrealized loss under held-to-maturity accounting, insurers are disincentivized to respond to trading gains that would simultaneously incur the losses of regulatory capital. I use detailed portfolio data and granular fixed effects to confirm the causal relationship between unrealized loss and insurer elasticity to liquidity shocks, and I use this relationship to quantify the price at which insurers value each unit of regulatory capital.

Depending on the past trajectory of monetary policy and macroeconomic conditions, unrealized losses can be large or small over time, which, based on my results, can lead to fluctuations in the aggregate market elasticity. This also suggests that policies that can temporarily reduce unrealized loss (e.g. asset purchases) can increase investor elasticity and reduce market dislocations during stress periods such as COVID. Outside of insurance companies, banks also hold a significant portion of their securities holdings under held-to-maturity accounting,

which increase the relevance of this channel for the aggregate market.

My findings also have implications for retail investors who provide capital to insurance companies or other intermediaries that are subject to held-to-maturity accounting. Because of the accounting rules, held-to-maturity intermediaries may forgo trading opportunities that will yield more economic profits that ultimately benefit the returns or safety of retail capital. The results echo the message in [ELLUL et al. \(2015\)](#) that held-to-maturity accounting is not panacea and can actually harm the welfare of retail investors.



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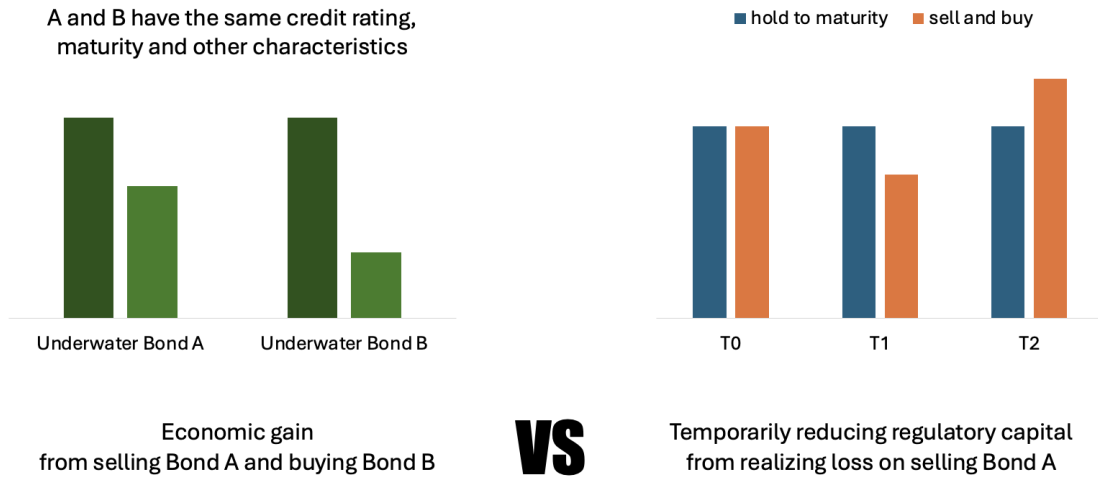
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# Figures

Figure 1: Trade-off between Trading Gains and Regulatory Costs.

Panel A



Panel B

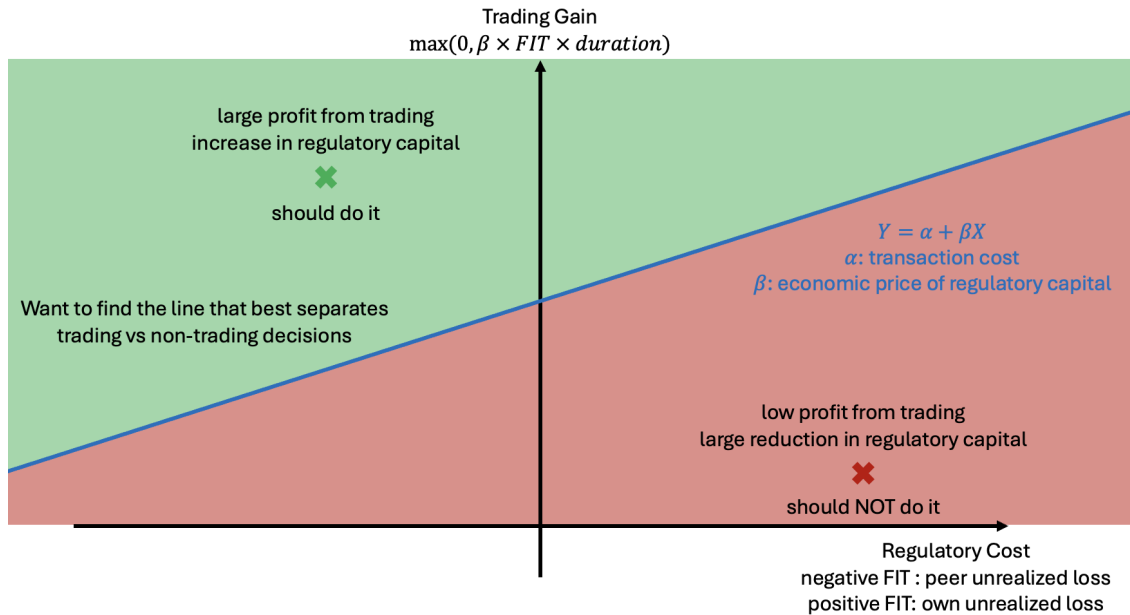
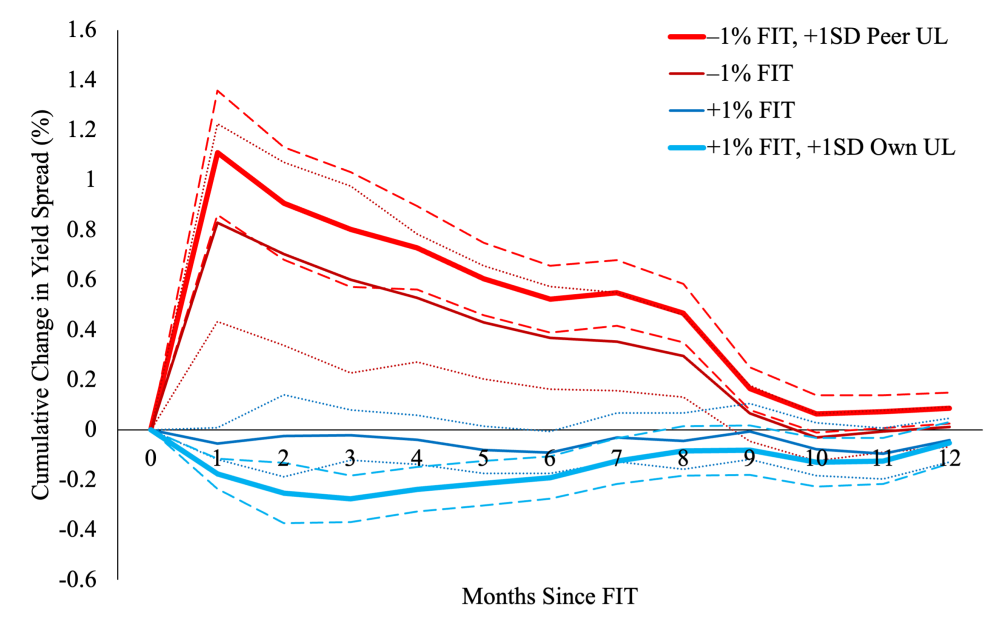


Figure 2: **Cumulative Yield Impact of Mutual Fund Flow-Induced Liquidity Shocks.** This figure plots cumulative yield spread changes in response to liquidity shocks coming from mutual fund flow-induced trading (FIT). The red lines (blue lines) plot yield response to -1% (+1%) FIT. The dark red / blue line plots yield impact for the average bond, and the bright red / blue line plots yield impact for bonds with one-standard-deviation higher unrealized losses across insurer holders (relative to amount outstanding). The solid lines show mean coefficients whereas the dash or dotted lines show 95% confidence intervals.



# Tables

Table 1: **Unrealized Loss and Insurer Elasticity.** These tables examine the response of insurer trading to liquidity shocks, measured by mutual fund flow-induced trading (Equation 3), and its dependence on unrealized losses on the bond and the bond's peers (i.e. those in the same rating, duration, and industry buckets), according to Regression 5:

$$\Delta Holding_{i,b,t} = \beta FlowInducedTrading_{b,t} \times UnrealizedLoss_{i,b,t-1} + \gamma Controls + FE + \epsilon_{i,b,t}$$

t-statistics are reported in parentheses. \*, \*\*, and \*\*\* denote p-values less than 0.10, 0.05, and 0.01, respectively.

Panel A: March 2020

Dependent Variable	Change in Holding (% , t-1 to t)		
	(1)	(2)	(3)
Flow-Induced Trading (% , t-1 to t)	-0.243** (-2.084)	-0.373** (-2.323)	
× Own Unrealized Loss (standardized, t-1)		0.028 (0.425)	0.012 (0.184)
× Peer Unrealized Loss (standardized, t-1)		0.294* (1.788)	0.315** (1.994)
Controls	bond rating, bond duration, bond amount outstanding (log), bond trading volume (log)		
Insurer FE	Y	Y	Y
Bond Peer Group FE	Y	Y	
Bond FE			Y
Standard Errors	Clustered by Insurer		
Observations	96752	95856	83215
R2	0.046	0.049	0.113

Panel B: All Crisis Periods

Dependent Variable	Change in Holding (% , t-1 to t)			
	(1)	(2)	(3)	(4)
Negative Flow-Induced Trading (% , t-1 to t)	-0.169* (-1.939)	-0.207* (-1.905)		
× Own Unrealized Loss (standardized, t-1)		-0.083 (-0.757)	0.007 (0.076)	0.009 (0.077)
× Peer Unrealized Loss (standardized, t-1)		0.199* (1.952)	0.371** (2.073)	0.157 (1.038)
× Peer UL × Large Capital Drawdown (t)				0.321* (1.827)
Positive Flow-Induced Trading (% , t-1 to t)	-0.114* (-1.665)	-0.154* (-1.940)		
× Own Unrealized Loss (standardized, t-1)		0.129* (1.884)	0.134 (1.522)	0.014 (0.244)
× Peer Unrealized Loss (standardized, t-1)		-0.093 (-1.383)	-0.047 (-0.705)	-0.044 (-0.664)
× Own UL × Large Capital Drawdown (t)				0.141* (1.832)
Controls	bond rating, bond duration, bond amount outstanding (log), bond trading volume (log)			
Insurer FE × Quarter FE	Y	Y	Y	Y
Bond Peer Group FE × Quarter FE	Y	Y		
Bond FE × Quarter FE			Y	Y
Standard Errors	Clustered by Insurer × Quarter			
Observations	867079	801679	799657	799657
R2	0.077	0.085	0.196	0.196

Table 2: **Unrealized Loss and Market Elasticity.** The tables examine the price impacts of liquidity shocks, measured by mutual fund flow-induced trading (Equation 3), and their dependence on unrealized losses on the bond and the bond's peers (i.e. those in the same rating, duration, and industry buckets), according to Regression 6:

$$\Delta YieldSpread_{b,t} = \beta FlowInducedTrading_{b,t} \times UnrealizedLoss_{b,t-1} + \gamma Controls + FE + \epsilon_{b,t}$$

Panel A focuses on the cross section of bonds in March 2020. Panel B studies all crisis periods in 2007-2009 and in 2020. t-statistics are reported in parentheses. \*, \*\*, and \*\*\* denote p-values less than 0.10, 0.05, and 0.01, respectively.

Panel A: March 2020

Dependent Variable	Change in Yield Spread (% , t-1 to t)		Change in CDS Basis (% , t-1 to t)	
	(1)	(2)	(3)	(4)
Flow-Induced Trading (% , t-1 to t)	-0.747*** (-4.375)	-0.406*** (-4.739)	-0.700*** (-3.004)	-0.421 (-1.185)
Own Unrealized Loss (standardized, t-1)		-0.203** (-2.353)		0.134 (0.359)
FIT × Own Unrealized Loss		-0.105 (-1.251)		0.588 (1.038)
Peer Unrealized Loss (standardized, t-1)		-0.143 (-1.262)		0.596 (0.803)
FIT × Peer Unrealized Loss		-0.420*** (-2.596)		-1.271* (-1.705)
Controls	yield spread (CDS basis), lagged change in yield spread (CDS basis), rating, duration, amount outstanding (log), trading volume (log)			
Fixed Effects	Rating FE × Duration FE × Industry FE			
Standard Errors	Clustered by Rating FE × Duration FE × Industry FE			
Observations	3483	3417	630	608
R2	0.771	0.777	0.545	0.559

Panel B: All Crisis Periods

Dependent Variable	Change in Yield Spread (% , t-1 to t)		Change in CDS Basis (% , t-1 to t)	
	(1)	(2)	(3)	(4)
Negative Flow-Induced Trading (% , t-1 to t)	-1.128*** (-7.397)	-0.829*** (-6.204)	-0.365** (-2.102)	-0.308** (-2.462)
× Own Unrealized Loss		-0.014 (-0.145)		0.334 (1.363)
× Peer Unrealized Loss		-0.280*** (-5.558)		-0.592* (-1.857)
Positive Flow-Induced Trading (% , t-1 to t)	-0.087** (-2.519)	-0.055* (-1.691)	-0.143** (-2.080)	-0.017 (-0.231)
× Own Unrealized Loss		-0.121*** (-4.280)		-0.407* (-1.959)
× Peer Unrealized Loss		0.044 (1.399)		-0.079 (-0.747)
Own Unrealized Loss (standardized, t-1)		-0.077*** (-5.134)		-0.079* (-1.755)
Peer Unrealized Loss (standardized, t-1)		-0.022 (-0.829)		0.132 (1.394)
Controls	yield spread (CDS basis), lagged change in yield spread (CDS basis), rating, duration, amount outstanding (log), trading volume (log)			
Fixed Effects	Rating FE × Duration FE × Industry FE × Quarter FE			
Standard Errors	Clustered by Rating × Duration × Industry FE and by Quarter			
Observations	32767	30772	8023	7509
R2	0.809	0.812	0.679	0.685



Table 3: **Determinants of Estimated Price of Regulatory Capital.** The table examines determinants of the estimated price of regulatory capital according to Section 5, based on Regression 9:

$$\tilde{\beta}_{i,t} = a + b\text{InsurerChar}_{i,t} + e_{i,t}$$

t-statistics are reported in parentheses. \*, \*\*, and \*\*\* denote p-values less than 0.10, 0.05, and 0.01, respectively.

Dependent Variable	Estimated Price of Regulatory Capital (\$, t)		
	(1)	(2)	(3)
RBC Ratio (t-1)	-0.11*** (-2.74)	-0.09* (-1.71)	-0.09* (-1.60)
Total Assets (Log, t-1)	0.03 (1.62)	0.02* (1.73)	0.02 (0.64)
Life Insurer	-0.13* (-1.66)	-0.13 (-1.61)	
Quarter FE		Y	Y
Insurer FE			Y
Observations	7987	7987	7985
R2	0.13	0.13	0.14

# Appendix A Additional Figures

Figure A1: **Mark-to-Market vs Held-to-Maturity Accounting.** This figure illustrates, for a bond whose price evolution is given by the black bars, the trajectory of its book value under mark-to-market accounting (blue bars), held-to-maturity accounting (red bars), and held-to-maturity accounting when trading (buying and selling of the same bond) occurs at T2 (pink bars).

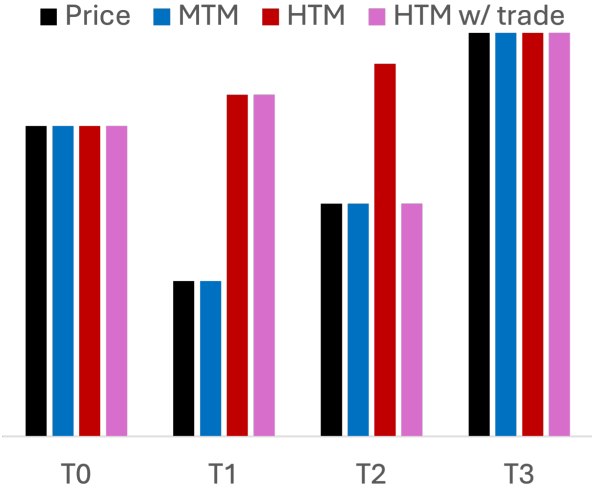


Figure A2: **Example of Insurance Regulatory Filing.** The figures show regulatory filings made by Security Benefit Life Insurance Company in 2016.

Capital Accounting

**ANNUAL STATEMENT FOR THE YEAR 2016 OF THE Security Benefit Life Insurance Company**

**SUMMARY OF OPERATIONS**

	1 Current Year	2 Prior Year
1. Premiums and annuity considerations for life and accident and health contracts (Exhibit 1, Part 1, Line 20.4, Col. 1, less Col. 11) .....	3,665,498,482	2,270,676,839
2. Considerations for supplementary contracts with life contingencies .....	41,049	2,242
3. Net investment income (Exhibit of Net Investment Income, Line 17) .....	1,026,225,718	743,442,804
4. Amortization of Interest Maintenance Reserve (IMR, Line 5) .....	11,546,136	4,074,029
5. Separate Accounts net gain from operations excluding unrealized gains or losses .....	0	0
6. Commissions and expense allowances on reinsurance ceded (Exhibit 1, Part 2, Line 26.1, Col. 1) .....	5,179,903	17,737,474
7. Reserve adjustments on reinsurance ceded .....		0
8. Miscellaneous income:		
8.1 Income from fees associated with investment management, administration and contract guarantees from Separate Accounts .....	55,161,182	59,501,930
8.2 Charges and fees for deposit-type contracts .....	0	0
8.3 Aggregate write-ins for miscellaneous income .....	188,096,778	174,478,335
9. Totals (Lines 1 to 8.3) .....	4,951,749,248	3,269,913,653
10. Death benefits .....	354,120	1,353,648
11. Matured endowments (excluding guaranteed annual pure endowments) .....	0	0
12. Annuity benefits (Exhibit 8, Part 2, Line 6.4, Cols. 4 + 8) .....	216,769,303	201,740,818
13. Disability benefits and benefits under accident and health contracts .....	1,347	4,831
14. Coupons, guaranteed annual pure endowments and similar benefits .....		0
15. Surrender benefits and withdrawals for life contracts .....	1,253,570,169	1,242,848,559
16. Group conversions .....		0
17. Interest and adjustments on contract or deposit-type contract funds .....	24,520,285	19,172,821
18. Payments on supplementary contracts with life contingencies .....		0
19. Increase in aggregate reserves for life and accident and health contracts .....	3,248,199,567	1,684,973,113
20. Totals (Lines 10 to 19) .....	4,743,414,791	3,150,093,790
21. Commissions on premiums, annuity considerations and deposit-type contract funds (direct business only) (Exhibit 1, Part 2, Line 31, Col. 1) .....	371,402,374	370,016,161
22. Commissions and expense allowances on reinsurance assumed (Exhibit 1, Part 2, Line 26.2, Col. 1) .....	2,236,007	1,995,167
23. General insurance expenses (Exhibit 2, Line 10, Columns 1, 2, 3 and 4) .....	196,227,061	104,408,043
24. Insurance taxes, licenses and fees, excluding federal income taxes (Exhibit 3, Line 7, Cols. 1 + 2 + 3) .....	2,862,126	2,508,239
25. Increase in loading on deferred and uncollected premiums .....	(6)	(8)
26. Net transfers to or (from) Separate Accounts net of reinsurance .....	(378,392,096)	(421,798,570)
27. Aggregate write-ins for deductions .....	139,451,930	5,603,948
28. Totals (Lines 20 to 27) .....	5,077,202,187	3,212,826,770
29. Net gain from operations before dividends to policyholders and federal income taxes (Line 9 minus Line 28) .....	(125,452,939)	57,086,883
30. Dividends to policyholders .....	58	66
31. Net gain from operations after dividends to policyholders and before federal income taxes (Line 29 minus Line 30) .....	(125,452,997)	57,086,817
32. Federal and foreign income taxes incurred (excluding tax on capital gains) .....	(32,843,553)	(13,783,945)
33. Net gain from operations after dividends to policyholders and federal income taxes and before realized capital gains or (losses) (Line 31 minus Line 32) .....	(92,609,444)	70,870,762
34. Net realized capital gains (losses) (excluding gains (losses) transferred to the IMR) less capital gains tax of \$ .....	11,564,194	4,554,892
11,243,556 (excluding taxes of \$ .....	31,230,071	transferred to the IMR)
35. Net income (Line 33 plus Line 34) .....	(81,045,250)	75,425,654
<b>CAPITAL AND SURPLUS ACCOUNT</b>		
36. Capital and surplus, December 31, prior year (Page 3, Line 38, Col. 2) .....	1,286,369,374	1,301,456,083
37. Net income (Line 35) .....	(81,045,250)	75,425,654
38. Change in net unrealized capital gains (losses) less capital gains tax of \$ .....	(2,033,478)	(2,181,588)
39. Change in net unrealized foreign exchange capital gain (loss) .....	(8,831,813)	(8,440,880)
40. Change in net deferred income tax .....	19,541,998	(9,946,666)
41. Change in nonadmitted assets .....	6,751,436	(2,962,258)
42. Change in liability for reinsurance in unauthorized and certified companies .....		0
43. Change in reserve on account of change in valuation basis, (increase) or decrease .....		0
44. Change in asset valuation reserve .....	(58,075,111)	(53,494,580)
45. Change in treasury stock (Page 3, Lines 36.1 and 36.2 Col. 2 minus Col. 1) .....		0
46. Surplus (contributed to) withdrawn from Separate Accounts during period .....		0
47. Other changes in surplus in Separate Accounts statement .....		0
48. Change in surplus notes .....	(49,987,779)	20,033
49. Cumulative effect of changes in accounting principles .....		0
50. Capital changes:		
50.1 Paid in .....		0
50.2 Transferred from surplus (Stock Dividend) .....		0
50.3 Transferred to surplus .....		0
51. Surplus adjustment:		
51.1 Paid in .....	289,366,509	0
51.2 Transferred to capital (Stock Dividend) .....		0
51.3 Transferred from capital .....		0
51.4 Change in surplus as a result of reinsurance .....	(1,021,854)	(13,506,424)
52. Dividends to stockholders .....		0
53. Aggregate write-ins for gains and losses in surplus .....	160,633,491	0
54. Net change in capital and surplus for the year (Lines 37 through 53) .....	275,298,149	(15,086,709)
55. Capital and surplus, December 31, current year (Lines 36 + 54) (Page 3, Line 38) .....	1,561,667,523	1,286,369,374

Bond Holdings

ANNUAL STATEMENT FOR THE YEAR 2016 OF THE Security Benefit Life Insurance Company

SCHEDULE D - PART 1

Showing All Long-Term BONDS Owned December 31 of Current Year

E10.15

Table with columns for CUSIP Identification, Description, Codes, Bond CHAR, NAIC Designation, Actual Cost, Fair Value, Par Value, Book/Adjusted Carrying Value, Unrealized Valuation Increase/Decrease, Current Year's (Amortization)/Accretion, Current Year's Temporary Impairment Recognized, Total Foreign Exchange Change in B./A.C.V., Rate of, Effective Rate of, When Paid, Admitted Amount Due & Accrued, Amount Rec. During Year, Dates, and Stated Contractual Maturity Date.

Bond Transactions (Purchases)

ANNUAL STATEMENT FOR THE YEAR 2016 OF THE Security Benefit Life Insurance Company

SCHEDULE D - PART 3

Showing All Long-Term Bonds and Stocks ACQUIRED During Current Year

Table with columns for CUSIP Identification, Description, Foreign, Date Acquired, Name of Vendor, Number of Shares of Stock, Actual Cost, Par Value, and Paid for Accrued Interest and Dividends.

# Bond Transactions (Sales)

## ANNUAL STATEMENT FOR THE YEAR 2016 OF THE Security Benefit Life Insurance Company

### SCHEDULE D - PART 4

Showing all Long-Term Bonds and Stocks **SOLD, REDEEMED** or Otherwise **DISPOSED** of During Current Year

1	2	3	4	5	6	7	8	9	10	Change in Book/Adjusted Carrying Value											19	20	21
										11	12	13	14	15	16	17	18	19	20	21			
CUSIP	Description	Disposal Date	Name of Purchaser	Number of Shares of Stock	Consideration	Par Value	Actual Cost	Prior Year Book/Adjusted Carrying Value	Unrealized Valuation Increase/ (Decrease)	Current Year (Amortization)/ Accretion	Current Year's Other-Than-Temporary Impairment Recognized	Total Change in B/A, C.V. (11+12+13)	Total Foreign Exchange Change in B/A, C.V.	Book/ Adjusted Carrying Value at Disposal Date	Foreign Exchange Gain (Loss) on Disposal	Realized Gain (Loss) on Disposal	Total Gain (Loss) on Disposal	Bond Interest/Stock Dividends Received During Year	Stated Contractual Maturity Date				
46916F-AB-6	321 HENDERSON RECEIVABLES LLC 2012-1A	12/15/2016	Paydown		48,111	48,111	48,100	48,300		11	0	11	0	48,111	0	0	0	2,872	02/15/2027				
46917F-AA-2	321 HENDERSON RECEIVABLES LLC 2013-1A	12/15/2016	Paydown		50,138	50,138	46,879	47,066		3,072	0	3,072	0	50,138	0	0	0	858	04/15/2029				
46917F-AA-4	321 HENDERSON RECEIVABLES LLC 2013-2A	12/15/2016	Paydown		743,530	743,530	743,205	743,231		298	0	298	0	743,530	0	0	0	16,216	03/15/2029				
46917F-AA-9	321 HENDERSON RECEIVABLES LLC 2013-3A	12/15/2016	Paydown		1,055,000	1,055,000	1,054,196	1,054,300		790	0	790	0	1,055,000	0	0	0	22,361	01/17/2023				
46917F-AA-2	321 HENDERSON RECEIVABLES LLC 2014-1A	12/15/2016	Paydown		1,016,132	1,016,132	1,015,599	1,015,589		543	0	543	0	1,016,132	0	0	0	23,195	03/15/2023				
46918A-AA-2	321 HENDERSON RECEIVABLES LLC 2014-2A	12/15/2016	Paydown		560,589	560,589	560,225	560,238		360	0	360	0	560,589	0	0	0	11,501	01/17/2023				
46934D-AD-7	JP WORGAN CHASE COMMERCIAL MWR 2009-HE1	02/04/2016	WELLS FARGO		16,802,344	15,000,000	16,431,563	15,731,437		(18,308)	0	(18,308)	0	15,713,130	0	(1,089,214)	(1,089,214)	157,255	12/05/2027				
46934D-AC-3	JP WORGAN CHASE COMMERCIAL MWR 2009-HE2	02/04/2016	WELLS FARGO		1,165,156	1,000,000	1,056,250	1,026,388		(626)	0	(626)	0	1,025,769	0	139,387	139,387	13,309	12/05/2027				
46939N-AD-0	JPWB COMMERCIAL MORTGAGE SECU 2013-2C1	12/01/2016	Paydown		0	0	147,055	134,721		(134,721)	0	(134,721)	0	0	0	0	0	32,077	07/15/2045				
46940W-AC-4	JP WORGAN MORTGAGE TRUST 2013-3 A3	02/22/2016	JPMORGAN SECURITIES INC.		792,774	784,076	779,553	779,181		6	0	6	0	779,187	0	13,588	13,588	6,238	07/25/2043				
46940W-AC-4	JP WORGAN MORTGAGE TRUST 2013-3 A3	02/22/2016	Paydown		22,000	22,000	21,869	21,873		137	0	137	0	22,000	0	0	0	83	07/25/2043				
46948B-BS-0	JPWB COMMERCIAL MORTGAGE SECU 2013-2C2	12/01/2016	Paydown		0	0	8,799	8,180		(8,180)	0	(8,180)	0	0	0	0	0	918	05/15/2046				
47020B-AF-8	JAMES CAMPBELL COMPANY INC	11/08/2016	COHEN AND COMPANY, LLC		529,285	500,000	500,000	500,000		0	0	0	0	500,000	0	29,285	29,285	89,301	09/30/2024				
47020B-AF-6	JAMES CAMPBELL COMPANY INC	11/08/2016	COHEN AND COMPANY, LLC		1,000,000	1,000,000	1,000,000	1,000,000		0	0	0	0	1,000,000	0	0	0	49,100	09/30/2024				
47219-AN-5	JEFFERIES GROUP LLC 6.875%	11/04/2016	JEFFERIES & COMPANY INC.		1,940,177	1,700,000	1,756,631	1,757,543		(8,912)	0	(8,912)	0	1,748,379	0	230,798	230,798	124,667	04/15/2021				
480200-AA-5	JONES LANG LASALLE INC	11/04/2016	JEFFERIES & COMPANY INC.		1,177,297	1,100,000	1,096,733	1,097,616		259	0	259	0	1,097,875	0	79,422	79,422	47,593	11/15/2022				
48030R-AG-9	LENOVO NETWORKS INC 4.300%	03/11/2016	Various		2,976,158	3,000,000	2,996,410	2,996,142		80	0	80	0	2,996,222	0	(20,064)	(20,064)	67,830	03/15/2024				
48030R-AJ-3	LENOVO 10/15/25	11/04/2016	ROBERT W. BAIRD & CO.		2,449,772	2,350,000	2,347,251	2,347,304		200	0	200	0	2,347,503	0	102,268	102,268	91,247	06/15/2025				
48030R-AJ-6	LENOVO 10/15/25	07/27/2016	MONIKA		495,500	500,000	470,000	486,154		535	0	535	0	486,689	0	9,360	9,360	2,793	05/15/2021				
48030R-AJ-6	KOF F FINANCIAL CLO LTD 2007-1A D	06/15/2016	Paydown		6,920,000	6,920,000	6,193,200	6,358,418		141,962	0	141,962	0	6,500,000	0	0	0	137,246	05/15/2021				
48072A-AB-8	KENYA FT DEFERRED ENERGY	11/15/2016	Redemption 100,000,000		20,112	28,112	24,812	25,246		2,866	0	2,866	0	28,112	0	0	0	1,291	05/15/2033				
48401-AB-6	KEMPER CORP 4.200% 02/15/25	11/07/2016	BITSUBISHI UFJ SECURITIES		2,547,800	2,500,000	2,488,425	2,488,509		117	0	117	0	2,488,626	0	48,874	48,874	134,427	02/15/2025				
48401-AB-6	KEMPER CORP 4.200% 02/15/25	12/14/2016	Various		35,488,200	35,000,000	34,908,800	34,919,659		6,388	0	6,388	0	34,926,039	0	542,191	542,191	2,198,769	04/01/2024				
484783-AC-0	Class B 8	12/30/2016	SS - SUIR CLIENT		58,650,000	58,650,000	58,650,000	58,650,000		0	0	0	0	58,650,000	0	0	0	3,745,047	12/15/2040				
48529P-AB-1	KESSLER PAR TRUST A,2 Class B Note	02/01/2016	SS - SUIR CLIENT		58,650,000	58,650,000	58,650,000	58,650,000		0	0	0	0	58,650,000	0	0	0	31,827,833	12/15/2040				
48529P-AA-4	KEPSYN ENERGY DELIVERY	11/29/2016	Redemption 100,000,000		640,000	640,000	640,000	640,000		0	0	0	0	640,000	0	0	0	35,840	11/29/2016				
48529P-AA-1	KUROP REALTY LP 3.800% 01/15/23	02/18/2016	WELLS FARGO		501,867	500,000	533,253	54,513		86	0	86	0	54,426	0	6,264	6,264	2,301	01/15/2023				
50179A-AC-1	LA-SBS COMMERCIAL MORTGAGE TRU 2006-2A	06/11/2016	Paydown		12,653,787	12,653,787	12,862,749	12,679,218		(16,431)	0	(16,431)	0	12,653,787	0	0	0	334,528	09/15/2036				
50180C-02-0	LA-SBS COMMERCIAL MORTGAGE TRU 2006-2A	08/11/2016	Paydown		15,000,000	15,000,000	16,099,219	15,268,889		(208,889)	0	(208,889)	0	15,000,000	0	0	0	439,529	11/15/2038				
50180J-AN-9	LA-SBS COMMERCIAL MORTGAGE TRU 2006-2A	03/23/2016	MERRILL LYNCH & CO INC		481,500	500,000	497,500	497,890		105	0	105	0	497,995	0	(16,055)	(16,055)	9,585	04/15/2022				
50184B-AA-6	LADER CAPITAL COMMERCIAL MERT 2013-2P	02/10/2016	MORGAN STANLEY		4,120,000	4,000,000	4,099,977	4,091,417		(1,259)	0	(1,259)	0	4,090,159	0	29,841	29,841	29,788	02/15/2036				
50184B-AC-2	LADER CAPITAL COMMERCIAL MERT 2013-2P	06/25/2016	MERRILL LYNCH & CO INC		16,020,117	15,000,000	15,314,892	15,316,488		(8,303)	0	(8,303)	0	15,307,985	0	712,132	712,132	263,459	02/15/2036				
50184B-AJ-7	LADER CAPITAL COMMERCIAL MERT 2013-2P	06/02/2016	BARCLAYS CAPITAL INC.		6,291,563	6,000,000	6,149,935	6,126,995		(3,799)	0	(3,799)	0	6,123,196	0	168,367	168,367	134,419	02/15/2036				
50184B-AJ-2	LADER CAPITAL COMMERCIAL MERT 2013-2P	10/27/2016	CREDIT SUISSE FIRST BOSTON		6,156,797	6,000,000	5,998,963	5,998,539		1,435	0	1,435	0	5,999,973	0	156,834	156,834	242,385	02/15/2036				
50203A-AJ-3	LA-SBS COMMUNICATIONS CORPORATION	11/16/2016	Various		6,512,310	6,000,000	6,393,540	6,389,822		(6,961)	0	(6,961)	0	6,393,735	0	289,585	289,585	338,000	10/15/2019				
50203A-AN-2	LAM CORP OF ABER DEWIS	02/18/2016	JEFFERIES & COMPANY INC.		2,038,500	2,000,000	1,966,898	1,972,710		429	0	429	0	1,973,222	0	85,338	85,338	24,889	11/01/2023				
50221-BA-6	LEMAN RE TRUST 2005-9N A1A	02/27/2016	Paydown		1,135,064	1,135,064	1,057,966	1,057,453		113,272	0	113,272	0	1,135,064	0	0	0	4,966	12/25/2035				
50225-9N-1	LEMAN RE TRUST 2005-9N A1A	06/03/2016	Various		10,911,911	13,625,808	11,322,193	11,565,022		34,253	0	34,253	0	11,584,355	0	(682,394)	(682,394)	32,684	02/25/2036				
50225-9N-3	LEMAN RE TRUST 2005-9N A1A	02/27/2016	Paydown		1,718,158	1,718,158	1,427,666	1,427,668		290,490	0	290,490	0	1,718,158	0	0	0	5,651	02/25/2036				
50225-9N-4	LEMAN RE TRUST 2005-9N A4A	02/27/2016	Paydown		700,696	700,696	579,249	579,249		121,447	0	121,447	0	700,696	0	0	0	2,540	11/25/2046				
50225-9N-5	LEMAN RE TRUST 2005-9N A4A	04/04/2016	BAY CREDIT PARTNERS, LLC		5,864,568	6,907,533	5,792,028	5,907,470		15,234	0	15,234	0	5,879,055	0	(45,986)	(45,986)	113,102	06/25/2037				
50225-9N-6	LEMAN RE TRUST 2007-15N A1A	11/27/2016	Paydown		1,653,288	1,653,288	1,378,119	1,412,491		240,787	0	240,787	0	1,653,288	0	0	0	5,838	06/25/2037				
52043-AC-5	LEWINETIA REALTY TRUST	11/04/2016	WELLS FARGO		1,313,130	1,300,000	1,298,115	1,299,027		988	0	988	0	1,299,015	0	23,115	23,115	49,725	06/15/2022				
52043-AC-1	LEWINETIA REALTY TRUST	11/04/2016	WELLS FARGO		2,538,400	2,500,000	2,487,075	2,487,543		209	0	209	0	2,487,753	0	38,647	38,647	101,255	06/15/2024				
53170-AC-5	LIBERTY MARKET LP 4.400%	06/14/2016	JEFFERIES & COMPANY INC.		5,725,035	5,350,000	5,319,064	5,324,198		1,224	0	1,224	0	5,325,420	0	399,615	399,615	197,474	02/15/2024				

Figure A3: **Aggregate Changes in Regulatory Capital.** This figure plots aggregate changes in regulatory capital coming from underwriting income and investment income (the first two terms in Equation 1), separately for life insurers and P&C insurers. Realized gains and losses are excluded, as they can be endogenously chosen by the firm to offset other capital losses. The shaded areas indicate NBER recessions.

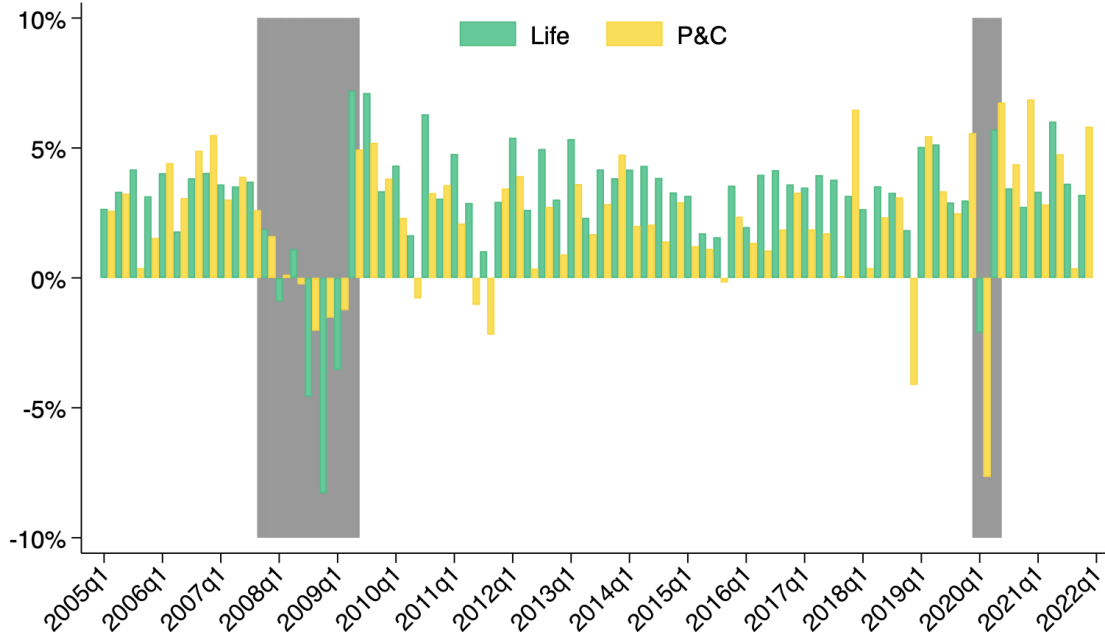


Figure A4: **Mutual Fund Flow-Induced Trading During Crisis Periods.** The figures plot mutual fund flow-induced trading (FIT) during the 2007-2009 great financial crisis (Panel A) and the 2020 COVID crisis (Panel B).

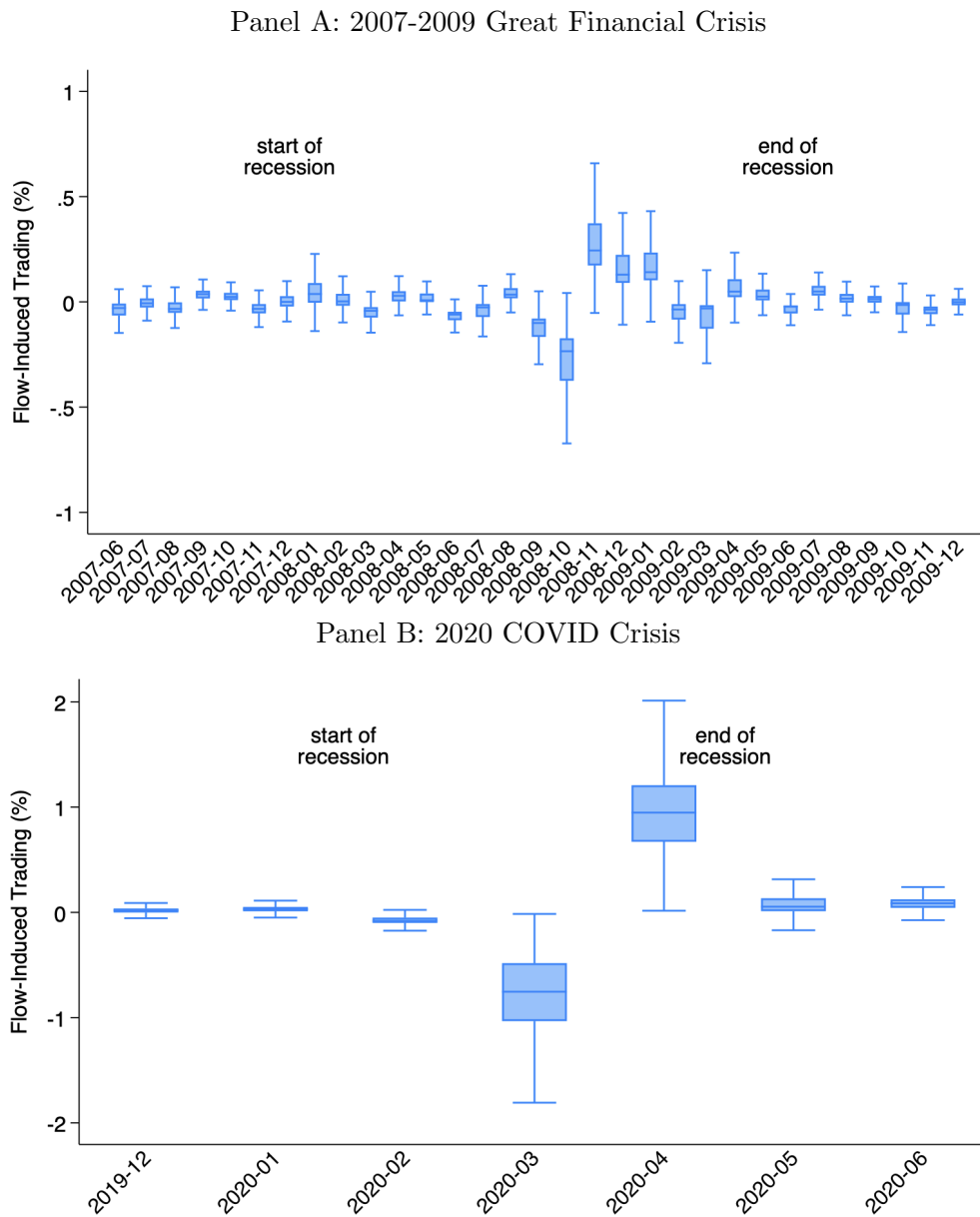
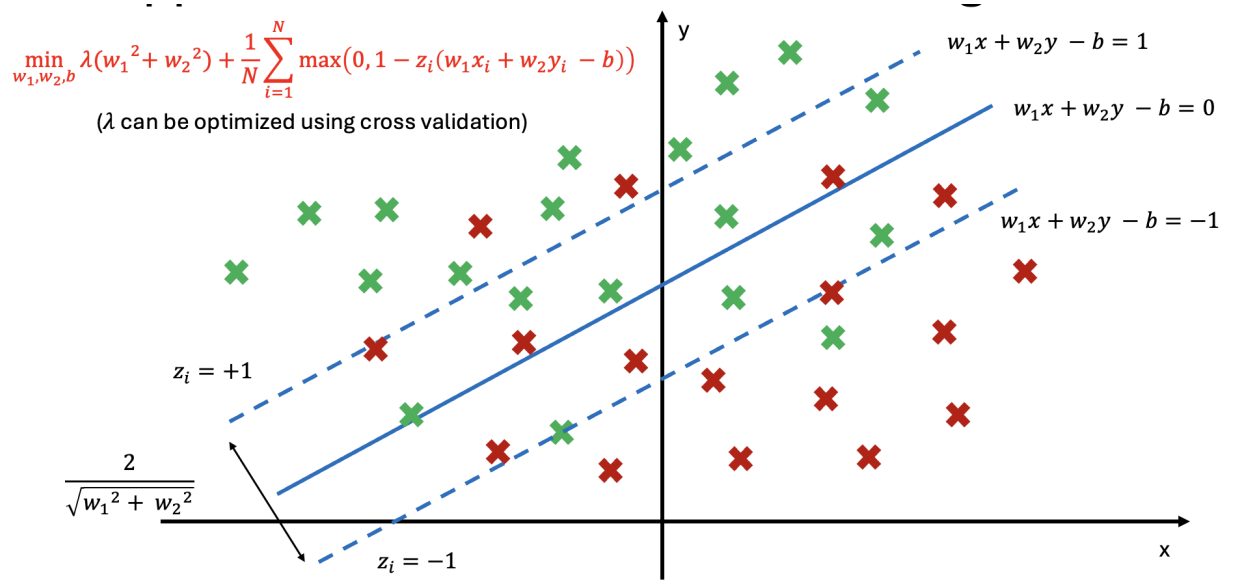


Figure A5: Illustration of Support Vector Machine (SVM).





## Appendix B Additional Tables

Table A1: **Summary Statistics.**

Panel A: Bond-Month Statistics

	N	Mean	SD	P5	P50	P95
Change in Yield Spread (%)	35915	0.17	1.23	-1.24	0.10	1.94
Change in CDS Basis (%)	8707	0.05	0.84	-1.12	0.02	1.47
Flow-Induced Trading (%)	35915	0.01	0.41	-0.55	0.00	0.68
Own Unrealized Loss (%)	35915	-0.31	4.78	-6.91	-0.31	6.62
Peer Unrealized Loss (%)	35915	-0.33	2.86	-4.74	-0.33	4.14