

# Price Pressure and the Turn-of-the-month Effect: Evidence from Retirement Accounts

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# Overview

- Turn-of-the-month (ToM) effect is the fact that stock returns are higher on days surrounding the turn of calendar months
- One popular explanation is that people typically get their salaries around end-of-the-month (Ogden, 1990)
  - Invest part of it in equities, e.g., through pension accounts
  - and their investment in equities creates price pressure around those days.

# Overview

- We test this hypothesis
- Key: a hand-collected comprehensive sample of mutual funds contained in 401K retirement accounts in the US, matched to individual stocks these mutual funds hold
- Retirement savings constitute a substantial chunk of equity investments of the salaried today

# Overview

- Explosive growth in retirement market.
  - E.g., grew 4 fold between 1990-2010, from 4 to 17 trillion \$ (Cohen and Malloy, 2012)

**U.S. Total Retirement Market Assets**  
*Billions of dollars, end-of-period, 1990–2010*

|      | IRAs               | DC plans <sup>a</sup> | Private<br>DB plans | State and local<br>government<br>pension plans | Federal<br>pension<br>plans <sup>b</sup> | Annuities <sup>c</sup> | Total  |
|------|--------------------|-----------------------|---------------------|--|--|------------------------|--------|
| 1990 | 636                | 892                   | 922                 | 742  | 340                                      | 391                    | 3,923  |
| 1991 | 776                | 1,060                 | 1,073               | 868  | 382                                      | 423                    | 4,582  |
| 1992 | 872                | 1,161                 | 1,098               | 957  | 426                                      | 473                    | 4,988  |
| 1993 | 993                | 1,319                 | 1,212               | 1,066  | 468                                      | 522                    | 5,581  |
| 1994 | 1,056              | 1,406                 | 1,303               | 1,117  | 512                                      | 526                    | 5,920  |
| 1995 | 1,288              | 1,717                 | 1,496               | 1,354  | 541                                      | 582                    | 6,978  |
| 1996 | 1,467              | 1,961                 | 1,623               | 1,538  | 606                                      | 626                    | 7,820  |
| 1997 | 1,728              | 2,343                 | 1,798               | 1,825  | 659                                      | 658                    | 9,012  |
| 1998 | 2,150              | 2,640                 | 1,948               | 2,063  | 716                                      | 818                    | 10,335 |
| 1999 | 2,651              | 2,997                 | 2,067               | 2,360  | 774                                      | 928                    | 11,778 |
| 2000 | 2,629              | 2,869                 | 2,020               | 2,340  | 797                                      | 951                    | 11,606 |
| 2001 | 2,619              | 2,701                 | 1,868               | 2,250  | 860                                      | 1,041                  | 11,339 |
| 2002 | 2,533              | 2,475                 | 1,656               | 1,974  | 894                                      | 1,001                  | 10,532 |
| 2003 | 2,993 <sup>e</sup> | 2,984                 | 1,977               | 2,396  | 958                                      | 1,125                  | 12,434 |
| 2004 | 3,299              | 3,306                 | 2,126               | 2,621  | 1,023                                    | 1,332                  | 13,708 |
| 2005 | 3,652 <sup>e</sup> | 3,576                 | 2,262               | 2,763  | 1,072                                    | 1,443                  | 14,768 |
| 2006 | 4,207 <sup>p</sup> | 4,084                 | 2,493               | 3,157  | 1,141                                    | 1,521                  | 16,603 |
| 2007 | 4,784 <sup>p</sup> | 4,354                 | 2,646               | 3,298  | 1,197                                    | 1,600                  | 17,880 |
| 2008 | 3,585 <sup>e</sup> | 3,379                 | 1,979               | 2,415  | 1,221                                    | 1,376                  | 13,954 |
| 2009 | 4,251 <sup>e</sup> | 4,041                 | 2,245               | 2,760  | 1,324                                    | 1,471                  | 16,092 |
| 2010 | 4,710 <sup>e</sup> | 4,486                 | 2,410               | 3,024  | 1,425                                    | 1,593                  | 17,649 |

# Overview

- Retirement accounts are about 48% of long-term mutual fund assets in 2010

**Mutual Fund Retirement Account Assets as a Share of Mutual Fund Assets**

*Billions of dollars, end-of-period, 1990–2010*

|      | All mutual funds                    |         |                    | Long-term funds <sup>a</sup>        |       |                    | Money market funds                  |       |                    |
|------|-------------------------------------|---------|--------------------|-------------------------------------|-------|--------------------|-------------------------------------|-------|--------------------|
|      | Retirement<br>accounts <sup>b</sup> | Total   | Share <sup>c</sup> | Retirement<br>accounts <sup>b</sup> | Total | Share <sup>c</sup> | Retirement<br>accounts <sup>b</sup> | Total | Share <sup>c</sup> |
|      | \$                                  | \$      | %                  | \$                                  | \$    | %                  | \$                                  | \$    | %                  |
| 1990 | \$208                               | \$1,065 | 20%                | \$146                               | \$567 | 26%                | \$62                                | \$498 | 12%                |
| 1991 | 325                                 | 1,393   | 23                 | 262                                 | 851   | 31                 | \$62                                | 542   | 12                 |
| 1992 | 423                                 | 1,643   | 26                 | 357                                 | 1,096 | 33                 | 66                                  | 546   | 12                 |
| 1993 | 588                                 | 2,070   | 28                 | 509                                 | 1,505 | 34                 | 79                                  | 565   | 14                 |
| 1994 | 672                                 | 2,155   | 31                 | 572                                 | 1,544 | 37                 | 100                                 | 611   | 16                 |
| 1995 | 925                                 | 2,811   | 33                 | 804                                 | 2,058 | 39                 | 121                                 | 753   | 16                 |
| 1996 | 1,199                               | 3,526   | 34                 | 1,044                               | 2,624 | 40                 | 155                                 | 902   | 17                 |
| 1997 | 1,574                               | 4,468   | 35                 | 1,421                               | 3,409 | 42                 | 153                                 | 1,059 | 14                 |
| 1998 | 1,990                               | 5,525   | 36                 | 1,797                               | 4,174 | 43                 | 193                                 | 1,352 | 14                 |
| 1999 | 2,590                               | 6,846   | 38                 | 2,363                               | 5,233 | 45                 | 227                                 | 1,613 | 14                 |
| 2000 | 2,558                               | 6,965   | 37                 | 2,323                               | 5,119 | 45                 | 236                                 | 1,845 | 13                 |
| 2001 | 2,430                               | 6,975   | 35                 | 2,151                               | 4,690 | 46                 | 279                                 | 2,285 | 12                 |
| 2002 | 2,169                               | 6,383   | 34                 | 1,866                               | 4,118 | 45                 | 303                                 | 2,265 | 13                 |
| 2003 | 2,767                               | 7,402   | 37                 | 2,492                               | 5,362 | 46                 | 275                                 | 2,040 | 13                 |
| 2004 | 3,191                               | 8,095   | 39                 | 2,945                               | 6,194 | 48                 | 246                                 | 1,901 | 13                 |
| 2005 | 3,575                               | 8,891   | 40                 | 3,319                               | 6,864 | 48                 | 255                                 | 2,027 | 13                 |
| 2006 | 4,228                               | 10,398  | 41                 | 3,929                               | 8,059 | 49                 | 300                                 | 2,338 | 13                 |
| 2007 | 4,770                               | 12,002  | 40                 | 4,397                               | 8,917 | 49                 | 373                                 | 3,086 | 12                 |
| 2008 | 3,290                               | 9,604   | 34                 | 2,821                               | 5,771 | 49                 | 469                                 | 3,832 | 12                 |
| 2009 | 4,141                               | 11,120  | 37                 | 3,740                               | 7,804 | 48                 | 401                                 | 3,316 | 12                 |
| 2010 | 4,686                               | 11,821  | 40                 | 4,334                               | 9,017 | 48                 | 353                                 | 2,804 | 13                 |

# Overview

- Retirement accounts are about a half of all mutual fund assets in 2010!

| 2010 Facts at a Glance  |                        |
|---|------------------------|
| <b>Total worldwide assets invested in mutual funds</b>          | <b>\$24.7 trillion</b> |
| <b>U.S. investment company total net assets</b>                 | <b>\$13.1 trillion</b> |
| Mutual funds  | \$11.8 trillion        |
| Exchange-traded funds   | \$992 billion          |
| Closed-end funds  | \$241 billion          |
| Unit investment trusts  | \$51 billion           |
| <b>U.S. investment companies' share of:</b>                     |                        |
| U.S. stocks   | 27%                    |
| U.S. municipal securities                                       | 33%                    |
| Commercial paper  | 45%                    |
| U.S. government securities                                      | 11%                    |
| <b>U.S. household ownership of mutual funds</b>                 |                        |
| Number of households owning mutual funds                        | 51.6 million           |
| Number of individuals owning mutual funds                       | 90.2 million           |
| Percentage of households owning mutual funds                    | 44%                    |
| Median amount fund-owning households invested in mutual funds   | \$100,000              |
| Median number of mutual funds owned                             | 4                      |
| <b>U.S. retirement market</b>                                   |                        |
| Total retirement market assets                                  | \$17.5 trillion        |
| Percentage of households with tax-advantaged retirement savings | 70%                    |
| IRA and DC plan assets invested in mutual funds                 | \$4.7 trillion         |

# Overview

- Shift from Defined Benefit (DB) plans to Defined Contribution (DC) plan
- Defined Benefit: employees guaranteed fixed benefits upon retirement
- Defined Contribution : employees allocate their contributions themselves among funds from a given list
- Typically, people behave very passively when it comes to these retirement accounts
- So, reasonable to think that huge chunks of passive money flowing into stocks held by retirement account funds is behind the Turn-of-the-month Effect

# Data

- Hand collected data on mutual fund investment options in 401K plans from EDGAR
- 20,000+ excel files, downloaded by script, hand-matched and standardized by hand
- Sample 2000-2012, data at the company-mutual fund-year level.
- Once collected, matched funds listed to the following databases:
  - Thomson Reuters
  - CRSP
  - CRSP US Mutual Fund (MFDB)



# Summary Statistics

## Plan characteristics, by year

| Year  | # firm | # unique<br>matched funds | # items<br>(include cash,<br>common<br>stock) | # funds | Matched #<br>funds | Mean       |            |                       | Median     |            |                       |                     |                 |
|-------|--------|---------------------------|---|---------|--------------------|------------|------------|-----------------------|------------|------------|-----------------------|---------------------|-----------------|
|       |        |                           |   |         |                    | Plan value | Fund value | Matched<br>fund value | Plan value | Fund value | Matched<br>fund value | matched<br>%(value) | matched<br>%(#) |
| 2000  | 830    | 1246                      | 17.3  | 14.2    | 8.0                | 294.8      | 202.5      | 95.5                  | 57.7       | 45.2       | 23.3                  | 47.1%               | 56.5%           |
| 2001  | 907    | 1058                      | 19.8  | 16.5    | 7.0                | 289.9      | 200.6      | 100.6                 | 54.4       | 41.7       | 15.3                  | 50.1%               | 42.4%           |
| 2002  | 994    | 1150                      | 20.8  | 17.5    | 7.2                | 294.8      | 198.7      | 77.0                  | 57.9       | 42.5       | 13.9                  | 38.8%               | 41.2%           |
| 2003  | 834    | 1257                      | 22.2  | 18.8    | 8.8                | 296.9      | 211.0      | 84.6                  | 57.6       | 43.9       | 18.3                  | 40.1%               | 47.0%           |
| 2004  | 811    | 1340                      | 22.1  | 19.0    | 9.3                | 327.6      | 237.0      | 108.5                 | 73.9       | 57.6       | 28.3                  | 45.8%               | 48.8%           |
| 2005  | 1185   | 1528                      | 23.6  | 20.5    | 9.8                | 348.4      | 251.7      | 114.3                 | 83.5       | 61.9       | 27.0                  | 45.4%               | 48.1%           |
| 2006  | 986    | 1449                      | 25.0  | 21.7    | 10.4               | 399.7      | 305.0      | 122.9                 | 86.6       | 66.4       | 26.9                  | 40.3%               | 47.9%           |
| 2007  | 931    | 1385                      | 24.9  | 21.7    | 11.0               | 513.1      | 405.5      | 154.8                 | 108.7      | 85.2       | 37.1                  | 38.2%               | 50.7%           |
| 2008  | 899    | 1444                      | 26.6  | 23.5    | 12.5               | 525.7      | 423.6      | 175.2                 | 115.8      | 97.2       | 41.5                  | 41.4%               | 53.4%           |
| 2009  | 879    | 1636                      | 27.4  | 24.5    | 14.7               | 377.5      | 301.7      | 128.6                 | 84.8       | 69.1       | 35.4                  | 42.6%               | 60.0%           |
| 2010  | 844    | 1666                      | 28.1  | 25.1    | 15.1               | 433.1      | 345.0      | 164.2                 | 115.2      | 99.4       | 49.9                  | 47.6%               | 60.0%           |
| 2011  | 807    | 1678                      | 28.7  | 25.8    | 16.0               | 517.3      | 406.7      | 200.6                 | 139.4      | 114.5      | 62.6                  | 49.3%               | 62.0%           |
| 2012  | 787    | 1546                      | 28.8  | 26.1    | 16.4               | 536.4      | 421.0      | 196.8                 | 140.8      | 117.0      | 61.7                  | 46.8%               | 63.0%           |
| Total | 1943   | 4692                      |   |         |                    |            |            |                       |            |            |                       |                     |                 |

# Hypothesis I

- First, we test for the continued existence of the ToM effect in US equity markets in the period for which we have 401K plan data:
- Hypothesis I:
  - $H_0$  (*ToM\_Existence*): There exists a ToM effect during the period under study.

# Question: Does the Turn-of-the-Month Effect still exist?

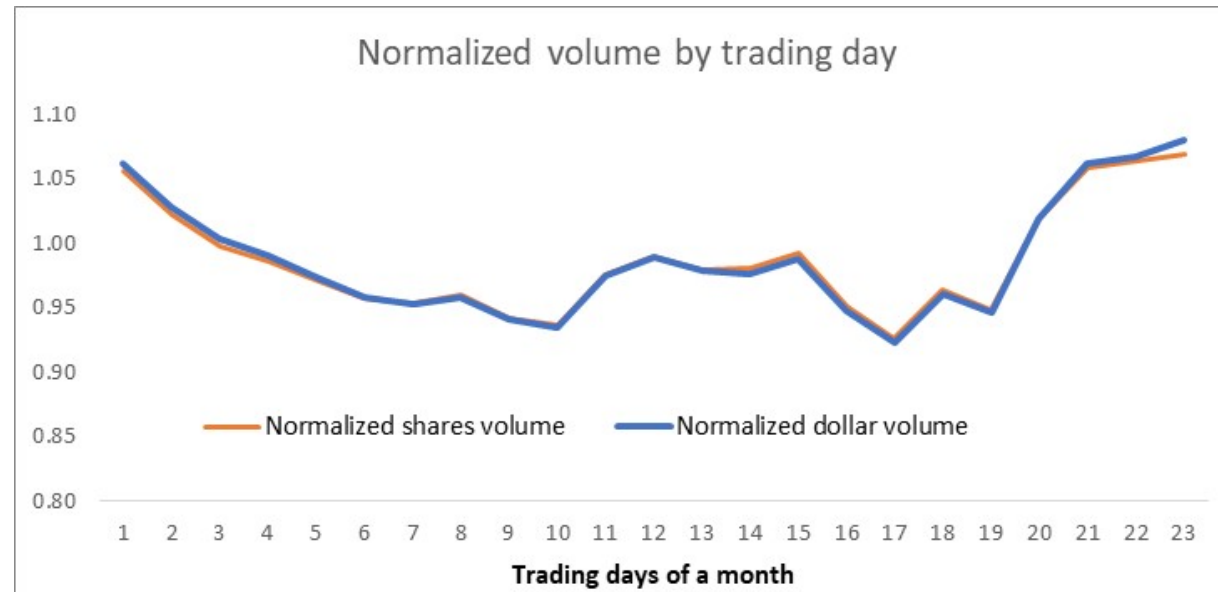


Figure 1: Volume around Turns-of-the-Month

# Empirical Methodology

- **Hypothesis I:  $H_0$  (ToM\_Existence)**: There exists a strong ToM effect, even for the period under study.
  - Using stock returns:

$$\text{Return}_t = \beta_0 + \beta_1 \cdot \text{ToM\_dummy}_t + \beta_2 \cdot X_{i,t-1} + \varepsilon_{i,t}$$

- ToM effect exists if  $\beta_1 > 0$ .

# Results #1: Does the Turn-of-the-Month Effect still exist?

|                | EWRETID            |                    |                    |                   | VWRETID            |                    |                    |                 |
|----------------|--------------------|--------------------|--------------------|-------------------|--------------------|--------------------|--------------------|-----------------|
|                | 1926-2017          | <=1980             | >1980              | 2000-2012         | 1926-2017          | <=1980             | >1980              | 2000-2012       |
| TOM            | 0.16<br>(9.50)***  | 0.185<br>(7.90)*** | 0.124<br>(5.31)*** | 0.131<br>(2.49)** | 0.129<br>(7.55)*** | 0.157<br>(7.24)*** | 0.085<br>(3.11)*** | 0.081<br>(1.36) |
| _cons          | 0.054<br>(7.29)*** | 0.054<br>(5.27)*** | 0.054<br>(5.39)*** | 0.038<br>(1.66)*  | 0.018<br>(2.34)**  | 0.01<br>(1.03)     | 0.03<br>(2.48)**   | 0.004<br>(0.13) |
| R <sup>2</sup> | 0.00               | 0.00               | 0.00               | 0.00              | 0.00               | 0.00               | 0.00               | 0.00            |
| N              | 24,289             | 14,958             | 9,331              | 3,269             | 24,289             | 14,958             | 9,331              | 3,269           |

Yes

ToM still there, especially on an equal weighted basis, i.e., it is likely stronger for smaller stocks

# Main Hypothesis

- Main Hypothesis:

Stocks held by retirement account plans—that get passive inflows at the turn of the month— have stronger turn-of-the-month returns

- $H_0$  (*Flow\_induced\_ToM*): There is a positive relationship between proportion of a stock held by 401K mutual funds and the ToM effect it experiences

# Question: What is the relation between the ToM Effect and 401K exposure of stocks

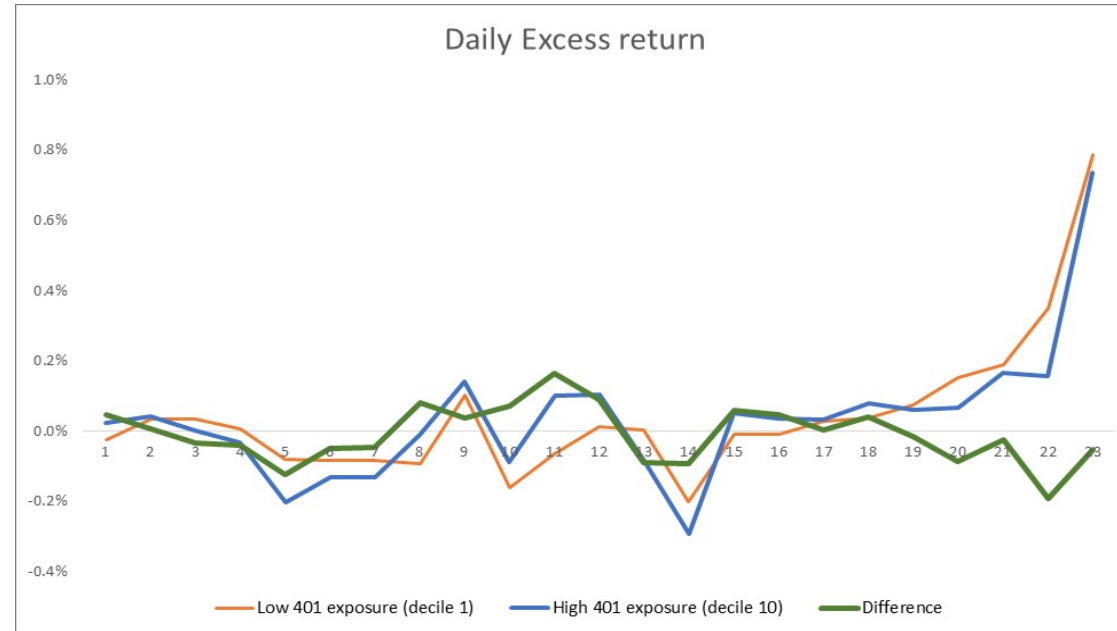


Figure 2: Daily excess returns, by 401(K) exposure of stocks

# Backed up by regression-based evidence

- **Hypothesis II:  $H_0$  (Flow\_induced\_ToM)**: There is a positive relationship between proportion of a stock held by 401K mutual funds and the ToM effect it experiences
  - $r_{i,t} = \beta_0 + \beta_1 \cdot \text{ToM} + \beta_2 \cdot \text{ToM} \cdot \text{Cap\_from\_401K}_{i,t} + \beta_3 \cdot X_{i,t} + \varepsilon_{i,t}$
  - If  $\beta_2 > 0$ , then stocks that are held more by 401K plans show a stronger ToM effect.



# Result #2a: Relation between the ToM Returns and 401K exposure of stocks

|                | return (%)       |                   |                     |                      |                    |                    |                   |
|----------------|------------------|-------------------|---------------------|----------------------|--------------------|--------------------|-------------------|
| TOM            | 0.104<br>(1.70)* | 0.139<br>(2.39)** | 0.12<br>(2.03)**    | 0.125<br>(2.17)**    | 0.137<br>(2.38)**  | 0.192<br>(3.26)*** | 0.199<br>(1.58)   |
| TOM*stk401wt   |                  | -0.16<br>(1.84)*  | -0.146<br>(-1.62)   | -0.15<br>(-1.71)*    | -0.157<br>(-1.81)* | -0.083<br>(-1.33)  | -0.08<br>(-1.3)   |
| MOM (t-12,t-2) |                  |                   | -0.06<br>(3.93)***  | -0.046<br>(5.52)***  |                    |                    |                   |
| Ret (t-1)      |                  |                   | -0.027<br>(-0.37)   | -0.029<br>(-1.02)    |                    |                    |                   |
| BEME           |                  |                   | -0.166<br>(7.39)*** | -0.145<br>(18.64)*** |                    |                    |                   |
| Price          |                  |                   | (0.00)              | (0.00)               |                    |                    |                   |
| Log(Size)      |                  |                   | -(1.10)             | (1.96)**             |                    |                    |                   |
| Stk401wt       |                  |                   | 0.032<br>(1.98)**   | 0.031<br>(4.55)***   |                    |                    |                   |
|                |                  |                   | -0.082<br>(1.73)*   | -0.039<br>(2.12)**   |                    |                    |                   |
| IO*TOM         |                  |                   |                     |                      |                    | -0.129<br>(1.85)*  | -0.106<br>(-1.46) |
| MOM*TOM        |                  |                   |                     |                      |                    |                    | 0.026<br>(0.76)   |
| Ret1m*TOM      |                  |                   |                     |                      |                    |                    | 0.011<br>(0.06)   |
| BEME*TOM       |                  |                   |                     |                      |                    |                    | 0.008<br>(0.27)   |
| Price*TOM      |                  |                   |                     |                      |                    |                    | 0.00<br>(0.31)    |
| Logsize*TOM    |                  |                   |                     |                      |                    |                    | -0.003<br>(-0.33) |
| Fixed effect   | Firm*month       | Firm*month        | Firm                | Firm, month          | Firm*month         | Firm*month         | Firm*month        |
| R <sup>2</sup> | 0.04             | 0.04              | 0                   | 0.01                 | 0.04               | 0.04               | 0.04              |
| N              | 12,040,032       | 12,040,032        | 10,019,371          | 10,019,371           | 11,932,846         | 11,881,504         | 10,019,370        |

## Turn-of-the-month Returns and 401(K) Exposure

# Result #2b: Relation between the ToM Volume Effect and 401K exposure of stocks

|                | Normalized shares volume |                   |                    |                     |                    |                    |                      |
|----------------|--------------------------|-------------------|--------------------|---------------------|--------------------|--------------------|----------------------|
| TOM            | 0.087<br>(10.78)***      | 0.09<br>(9.70)*** | 0.087<br>(9.21)*** | 0.087<br>(9.24)***  | 0.089<br>(9.65)*** | 0.091<br>(7.78)*** | 0.166<br>(6.63)***   |
| TOM*stk401wt   |                          | -0.013<br>(-1.09) | -0.011<br>(-0.89)  | -0.011<br>(-0.89)   | -0.012<br>(-1.03)  | -0.009<br>(-1.07)  | -0.007<br>(-0.8)     |
| MOM (t-12,t-2) |                          |                   | 0.001<br>(0.63)    | 0.001<br>(2.37)**   |                    |                    |                      |
| Ret (t-1)      |                          |                   | -0.003<br>(-0.44)  | -0.004<br>(-2.54)** |                    |                    |                      |
| BEME           |                          |                   | 0<br>(0.23)        | -0.001<br>(-1.4)    |                    |                    |                      |
| Price          |                          |                   | 0<br>(0.19)        | 0<br>(0.48)         |                    |                    |                      |
| Log(Size)      |                          |                   | 0.004<br>(1.54)    | 0.004<br>(5.67)***  |                    |                    |                      |
| Stk401wt       |                          |                   | 0.006<br>(1.14)    | 0.003<br>(1.30)     |                    |                    |                      |
| IO*TOM         |                          |                   |                    |                     |                    | -0.005<br>(-0.47)  | 0.012<br>(-1.13)     |
| MOM*TOM        |                          |                   |                    |                     |                    |                    | -0.004<br>(1.46)     |
| Ret1m*TOM      |                          |                   |                    |                     |                    |                    | 0.015<br>(0.84)      |
| BEME*TOM       |                          |                   |                    |                     |                    |                    | -0.009<br>(-2.49)**  |
| Price*TOM      |                          |                   |                    |                     |                    |                    | 0.000<br>(3.07)***   |
| Logsize*TOM    |                          |                   |                    |                     |                    |                    | -0.006<br>(-3.84)*** |
| Fixed effect   | Firm*month               | Firm*month        | Firm               | Firm, month         | Firm*month         | Firm*month         | Firm*month           |
| R <sup>2</sup> | 0.01                     | 0.01              | 0                  | 0                   | 0.01               | 0.01               | 0.01                 |
| N              | 12,047,578               | 12,047,578        | 10,026,231         | 10,026,231          | 11,940,335         | 11,888,993         | 10,026,229           |

**Turn-of-the-month Volume and 401(K) Exposure**

# Issue: Liquid vs less-liquid stocks

- Maybe there are no patterns for the average stock, but is there a pattern for less liquid stocks, where price pressure is likely to have the most impact?
- Hypothesis III:
  - $H_0$  (*Liquidity, flows, and ToM*): The 401K fund-held proportion of market cap of a stock is related to its ToM effect if the stock is less liquid.

# Empirical Methodology

- **Hypothesis III:  $H_0$  (Liquidity, flows, and ToM):** The 401K fund-held proportion of market cap of a stock is related to its ToM effect if the stock is less liquid
- $r_{i,t} = \beta_0 + \beta_1 \cdot \text{ToM} + \beta_2 \cdot \text{ToM} \cdot \text{Liquidity}_{i,t} + \beta_3 \cdot \text{ToM} \cdot \text{Cap\_from\_401K}_{i,t} \cdot \text{Low\_Liquidity}_{i,t} + \beta_4 \cdot X_{i,t}$ 
  - If  $\beta_3 > 0$ , then less liquid stocks that are held by 401K plans show a stronger ToM effect.

# Result #3: The Role of Liquidity

## Liquidity Measures in our Sample

| Correlations |        |        |        |
|--------------|--------|--------|--------|
|              | amihud | bidask | fzeros |
| amihud       | 1      | 0.482  | 0.216  |
| bidask       | 0.482  | 1.000  | 0.735  |
| fzeros       | 0.216  | 0.735  | 1.000  |

Liquidity measures are correlated.

However, their correlations are not high, so separate tests using these different measures in isolation have independent value

# Result #3a: The Role of Liquidity

## Continuous Liquidity Measures

|                     | Daily return (%)  |                    |                    |                   |                    |                    |                   |                   |                     |
|---------------------|-------------------|--------------------|--------------------|-------------------|--------------------|--------------------|-------------------|-------------------|---------------------|
| TOM                 | 0.102<br>(1.65)*  | 0.138<br>(2.31)**  | 0.123<br>(2.08)**  | 0.056<br>(0.8)    | 0.083<br>(1.29)    | 0.074<br>(1.13)    | 0.051<br>(0.68)   | 0.08<br>(1.16)    | 0.07<br>(1.01)      |
| TOM*Amihud          | 0.139<br>(0.62)   | 0.068<br>(0.29)    | 0.159<br>(0.66)    |                   |                    |                    |                   |                   |                     |
| TOM*Amihud*stk401wt |                   | -0.211<br>(-0.43)  | -0.611<br>(-1.33)  |                   |                    |                    |                   |                   |                     |
| Amihud              | -3.917<br>(-0.12) | 0.441<br>(0.01)    | 0.617<br>(4.96)*** |                   |                    |                    |                   |                   |                     |
| Amihud*stk401wt     |                   | -83.431<br>(-0.4)  | 0.088<br>(0.37)    |                   |                    |                    |                   |                   |                     |
| TOM*BidAsk          |                   |                    |                    | 4.296<br>(2.34)** | 3.809<br>(2.70)*** | 3.712<br>(2.39)**  |                   |                   |                     |
| TOM*BidAsk*stk401wt |                   |                    |                    |                   | -0.085<br>(0.02)   | 0.289<br>(0.07)    |                   |                   |                     |
| BidAsk              |                   |                    |                    | 48.235<br>(0.36)  | -2.186<br>(-0.02)  | 5.808<br>(7.59)*** |                   |                   |                     |
| BidAsk*stk401wt     |                   |                    |                    |                   | 507.732<br>(1.05)  | 1.139<br>(0.91)    |                   |                   |                     |
| TOM*Fzeros          |                   |                    |                    |                   |                    |                    | 1.228<br>(2.22)** | 1.058<br>(2.36)** | 1.041<br>(2.18)**   |
| TOM*Fzeros*stk401wt |                   |                    |                    |                   |                    |                    |                   | 0.211<br>(0.25)   | 0.409<br>(0.43)     |
| Fzeros              |                   |                    |                    |                   |                    |                    | 26.033<br>(1.23)  | 18.628<br>(0.82)  | 1.239<br>(4.67)***  |
| Fzeros*stk401wt     |                   |                    |                    |                   |                    |                    |                   | 162.527<br>(1.02) | 0.59<br>(1.94)*     |
| TOM*stk401wt        |                   | -0.159<br>(-1.80)* | -0.146<br>(-1.65)* |                   | -0.097<br>(-1.17)  | -0.094<br>(-1.09)  |                   | -0.103<br>(-1.21) | -0.1<br>(-1.14)     |
| Stk401wt            |                   |                    | -0.038<br>(2.02)** |                   |                    | -0.048<br>(2.52)** |                   |                   | -0.061<br>(3.11)*** |
| Fixed effect        | Firm*month        | Firm*month         | Firm, month        | Firm*month        | Firm*month         | Firm, month        | Firm*month        | Firm*month        | Firm, month         |
| Other controls      | yes               | yes                | yes                | yes               | yes                | yes                | yes               | yes               | yes                 |
| R <sup>2</sup>      | 0.04              | 0.04               | 0.01               | 0.04              | 0.04               | 0.01               | 0.04              | 0.04              | 0.01                |
| N                   | 12,040,765        | 12,040,765         | 10,026,169         | 12,034,628        | 12,034,628         | 10,019,652         | 12,040,765        | 12,040,765        | 10,026,169          |

# Result #3b: The Role of Liquidity

## Liquidity Groups (high vs. low)

|                      | Daily return (%)  |                   |                    |                   |                   |                    |                 |                   |                    |
|----------------------|-------------------|-------------------|--------------------|-------------------|-------------------|--------------------|-----------------|-------------------|--------------------|
| TOM                  | 0.082<br>(1.17)   | 0.135<br>(1.69)*  | 0.114<br>(1.48)    | 0.079<br>(1.13)   | 0.131<br>(1.63)   | 0.112<br>(1.47)    | 0.081<br>(1.11) | 0.127<br>(1.55)   | 0.106<br>(1.36)    |
| TOM*rAmihud          | 0.043<br>(1.47)   | 0.006<br>(0.12)   | 0.018<br>(0.38)    |                   |                   |                    |                 |                   |                    |
| TOM*rAmihud*stk401wt |                   | 0.048<br>(0.65)   | 0.031<br>(0.45)    |                   |                   |                    |                 |                   |                    |
| rAmihud              | -0.008<br>(-0.04) | 0.082<br>(0.36)   | 0.174<br>(9.62)*** |                   |                   |                    |                 |                   |                    |
| rAmihud*stk401wt     |                   | -0.583<br>(-0.72) | -0.039<br>(-1.69)* |                   |                   |                    |                 |                   |                    |
| TOM*rBidAsk          |                   |                   |                    | 0.048<br>(1.67)*  | 0.011<br>(0.21)   | 0.02<br>(0.43)     |                 |                   |                    |
| TOM*rBidAsk*stk401wt |                   |                   |                    |                   | 0.057<br>(0.70)   | 0.039<br>(0.51)    |                 |                   |                    |
| rBidAsk              |                   |                   |                    | -0.037<br>(-0.09) | -0.098<br>(-0.24) | 0.118<br>(7.42)*** |                 |                   |                    |
| rBidAsk*stk401wt     |                   |                   |                    |                   | 0.427<br>(0.25)   | -0.042<br>(-1.82)* |                 |                   |                    |
| TOM*rFzeros          |                   |                   |                    |                   |                   |                    | 0.044<br>(1.38) | 0.019<br>(0.38)   | 0.032<br>(0.7)     |
| TOM*rFzeros*stk401wt |                   |                   |                    |                   |                   |                    |                 | 0.019<br>(0.28)   | -0.003<br>(0.05)   |
| rFzeros              |                   |                   |                    |                   |                   |                    | 1.253<br>(0.77) | 0.259<br>(0.51)   | 0.088<br>(5.88)*** |
| rFzeros*stk401wt     |                   |                   |                    |                   |                   |                    |                 | 18.473<br>(0.75)  | -0.045<br>(2.34)** |
| TOM*stk401wt         |                   | -0.17<br>(-1.4)   | -0.147<br>(-1.25)  |                   | -0.169<br>(-1.36) | -0.148<br>(-1.24)  |                 | -0.157<br>(-1.35) | -0.133<br>(-1.2)   |
| Stk401wt             |                   |                   | 0.004<br>(0.17)    |                   |                   | -0.002<br>(-0.08)  |                 |                   | -0.012<br>(-0.5)   |
| Fixed effect         | Firm*month        | Firm*month        | Firm, month        | Firm*month        | Firm*month        | Firm, month        | Firm*month      | Firm*month        | Firm, month        |
| Other controls       | yes               | yes               | yes                | yes               | yes               | yes                | yes             | yes               | yes                |
| R <sup>2</sup>       | 0.04              | 0.04              | 0.01               | 0.04              | 0.04              | 0.01               | 0.04            | 0.04              | 0.01               |
| N                    | 12,040,765        | 12,040,765        | 10,026,169         | 12,034,628        | 12,034,628        | 10,019,652         | 12,040,765      | 12,040,765        | 10,026,169         |

# Bad data or match quality driving non-results?

- Maybe we have a very noisy measure of what are retirement account funds
- Typically target-date funds are default funds in a majority of 401K plans
  - We design an “out-of-sample” test using target-date fund holdings



# 'Out-of-sample' test using Target-date funds

- We check Ogden's hypothesis using holdings of target-date funds
- Hypothesis IV:
  - $H_0$  (*Target-date\_Funds\_ToM*): There is a positive relationship between proportion of a stock held by Target-date mutual funds and the ToM effect it experiences.

# Empirical Methodology

- **Hypothesis IV:**  $H_0$  (*Target-date\_Funds\_ToM*): There is a positive relationship between proportion of a stock held by Target-date mutual funds and the ToM effect it experiences.
  - For Hypothesis IV, we use the same technique, but only count target-date funds, which are typically used as default funds in 401K plans.

# Result #4: Out-of-sample evidence: Target Date Funds

## Target date funds and the Turn-of-the-Month Effect

|                | Daily return in % |                   |                     |                       |                   |                   |                      |
|----------------|-------------------|-------------------|---------------------|-----------------------|-------------------|-------------------|----------------------|
| TOM            | 0.084<br>(1.31)   | 0.147<br>(2.52)** | 0.136<br>(2.30)**   | 0.141<br>(2.46)**     | 0.148<br>(2.52)** | 0.148<br>(2.33)** | 0.603<br>(3.27)***   |
| TOM*Targetwt   |                   | -0.089<br>(-1.35) | -0.085<br>(-1.28)   | -0.086<br>(-1.32)     | -0.089<br>(-1.35) | -0.087<br>(-1.36) | -0.106<br>(-1.59)    |
| MOM (t-12,t-2) |                   |                   | 0.011<br>(0.57)     | 0.012<br>(1.13)       |                   |                   |                      |
| Ret (t-1)      |                   |                   | 0.004<br>(0.03)     | -0.151<br>(-2.90)***  |                   |                   |                      |
| BEME           |                   |                   | 0.001<br>(0.05)     | -0.001<br>(-0.14)     |                   |                   |                      |
| Price          |                   |                   | 0.0000<br>(0.31)    | 0.0000<br>(0.49)      |                   |                   |                      |
| Log(Size)      |                   |                   | -0.21<br>(-8.27)*** | -0.195<br>(-15.98)*** |                   |                   |                      |
| Targetwt       |                   |                   | 0.026<br>(0.68)     | 0.003<br>(0.14)       |                   |                   |                      |
| IO*TOM         |                   |                   |                     |                       |                   | -0.007<br>(-0.11) | 0.132<br>(2.10)**    |
| MOM*TOM        |                   |                   |                     |                       |                   |                   | 0.051<br>(1.03)      |
| Ret1m*TOM      |                   |                   |                     |                       |                   |                   | 0.255<br>(0.85)      |
| BEME*TOM       |                   |                   |                     |                       |                   |                   | -0.01<br>(-0.42)     |
| Price*TOM      |                   |                   |                     |                       |                   |                   | 0.0000<br>(0.18)     |
| Log(Size)*TOM  |                   |                   |                     |                       |                   |                   | -0.039<br>(-3.19)*** |
| Fixed effect   | Firm*month        | Firm*month        | Firm                | Firm, month           | Firm*month        | Firm*month        | Firm*month           |
| R <sup>2</sup> | 0.04              | 0.04              | 0                   | 0.01                  | 0.04              | 0.04              | 0.04                 |
| N              | 10,264,386        | 10,264,386        | 9,666,205           | 9,666,205             | 10,258,747        | 10,067,166        | 9,599,521            |

# Is there any evidence at all on daily trading patterns related to retirement account holdings?

- We examine every single calendar day of the month:
  - Purely exploratory, data-dredging exercise
- Try to understand whether stocks held most heavily by retirement funds have significantly high returns on any of these days
- Find that the **middle-of-the-month days** show a different pattern

# Result #5: Retirement Funds and a Mid-month effect

## Retirement flows and a Mid-Month Effect?

|                | Daily return in % |                   |                      |                       |                   |                    |                     |
|----------------|-------------------|-------------------|----------------------|-----------------------|-------------------|--------------------|---------------------|
| midm           | -0.021<br>(-0.26) | -0.032<br>(-0.41) | -0.029<br>(-0.35)    | -0.025<br>(-0.32)     | -0.032<br>(-0.41) | -0.041<br>(-0.48)  | -0.313<br>(-1.99)** |
| midm*D_Highwt  |                   | 0.052<br>(2.33)** | 0.05<br>(2.20)**     | 0.05<br>(2.21)**      | 0.052<br>(2.33)** | 0.048<br>(1.73)*   | 0.051<br>(1.81)*    |
| MOM (t-12,t-2) |                   |                   | -0.058<br>(3.81)***  | -0.046<br>(5.52)***   |                   |                    |                     |
| Ret (t-1)      |                   |                   | -0.03<br>(-0.41)     | -0.029<br>(-1.02)     |                   |                    |                     |
| BEME           |                   |                   | -0.172<br>(-7.15)*** | -0.146<br>(-18.71)*** |                   |                    |                     |
| Price          |                   |                   | -0.00<br>(-0.78)     | 0.00<br>(2.10)**      |                   |                    |                     |
| Log(Size)      |                   |                   | 0.028<br>(1.65)*     | 0.031<br>(4.48)***    |                   |                    |                     |
| D_Highwt       |                   |                   | -0.035<br>(-6.29)*** | -0.037<br>(-7.79)***  |                   |                    |                     |
| IO*TOM         |                   |                   |                      |                       | 0.017<br>(0.13)   | -0.132<br>(-0.98)  |                     |
| MOM*TOM        |                   |                   |                      |                       |                   | -0.05<br>(-1.11)   |                     |
| Ret1m*TOM      |                   |                   |                      |                       |                   | -0.19<br>(-0.92)   |                     |
| BEME*TOM       |                   |                   |                      |                       |                   | -0.054<br>(-1.41)  |                     |
| Price*TOM      |                   |                   |                      |                       |                   | 0.00<br>(3.00)***  |                     |
| Log(Size)*TOM  |                   |                   |                      |                       |                   | 0.031<br>(2.76)*** |                     |
| Fixed effect   | Firm*month        | Firm*month        | Firm                 | Firm*month            | Firm*month        | Firm*month         | Firm*month          |
| R <sup>2</sup> | 0.04              | 0.04              | 0.00                 | 0.04                  | 0.04              | 0.04               | 0.04                |
| N              | 12,047,586        | 12,047,586        | 10,026,169           | 10,026,169            | 12,047,586        | 11,996,162         | 10,026,168          |

# Result #5: Retirement Funds and a Mid-month effect

- Stocks exposed to retirement flows have significantly higher returns in the middle of the trading month
- This is true for days 10 and 11 (out of 23 typical trading days) of the month, which correspond to the middle week of the calendar month
- We consistently find that average stock returns are not significantly different on average on middle-of-the-month days
- But returns on stocks held by retirement funds are on average 5 basis points higher in the middle of the month
  - This is a new finding in this literature, although the magnitude is not very big

# Result #5: Retirement Funds and a Mid-month effect

- **Why?** Two possibilities:
- It takes time (typically up to a week, sometimes longer) for the funds to get money from pension plan contributions
  - This lag moves the price-pressure into the middle of the month from the beginning of the month
- Retirement fund managers know that there is a ToM effect in the market, and they rationally anticipate that adding their large buy orders during the ToM days would exacerbate the price pressure
  - So they hold on to retirement account money for a few days into the month to get better prices

# Conclusion

- In this study, we hand collect publicly available data from the SEC's Edgar database on regulatory filings of retirement savings plans (Form 11-K) in the US.
- The plan filings include information on the mutual funds that are included as savings options, and the employees' allocation to these funds, for each individual company.
- Using this sample, we find no evidence to support the hypothesis that systematic month-end flows, related to the monthly payment cycle, causes the ToM effect.