Stock Market Milestones and Mortgage Demand: Evidence from US

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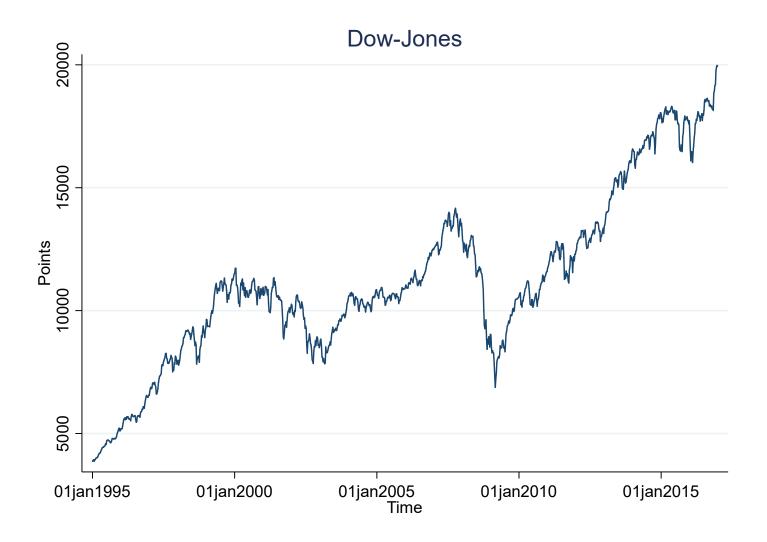
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SMU Classification: Restricted

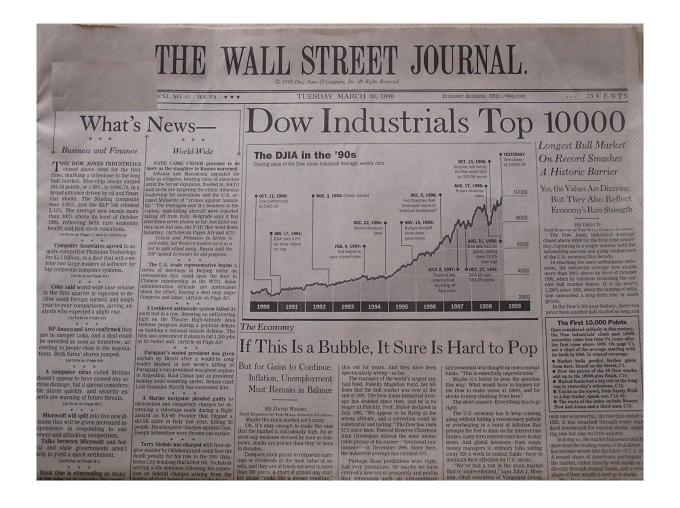
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Dow-Jones Index

1995-2016



Dow 10,000



Dow 20,000

THE WALL STREET JOURNAL.



Dow 20,000





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BUSINESS NEWS NOVEMBER 25, 2020 / 12:38 AM / UPDATED A YEAR AGO

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By Reuters Staff

2 MIN READ







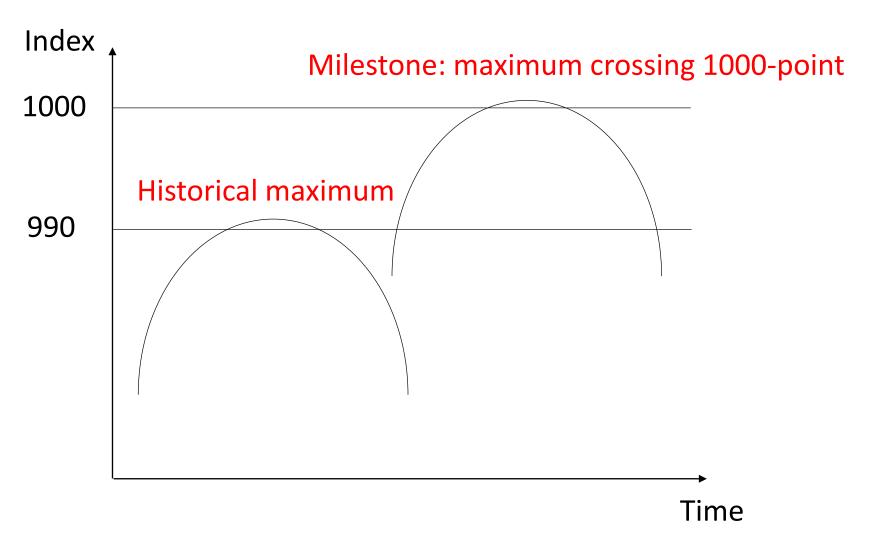
This Paper

- Question
 - How do stock market increases impact demand for housing?
- Challenge
 - Stock market and housing demand related with other factors (e.g. interest rate)
- What we do
 - We compare weeks in which stock-market indices reach a maximum and cross/not-cross a milestone (e.g. Dow 10000, S&P 2000)
 - Maximum-only and milestone weeks are indistinguishable on a series of economic indicators
 - While a milestone has no economic importance, it increases news—and therefore attention—of an increase in wealth

Our strategy

- Scenario A: Historical maximum
 - Stock index closes at 985, 995 and 990 at day -1, day 0, and day 1
 - It is the first time the stock index reaches 995.
- Scenario B: Milestone: maximum crossing 1000-point
 - Stock index closes at 995, 1005 and 1000 at day -1, day 0, and day 1
 - It is the first time the stock index reaches 1005
- Scenario A and B have similar return before reaching the maximum
- Key difference: milestone grabs more attention of investors
- The differential effects between the milestone and the historical maximum capture the attention effect in addition to the wealth effect.

Our strategy



Findings

- In the weeks stock-market indices reach milestones there is
 - Doubling of news and internet searches mentioning "stock market"
 - Individual investor bullishness rises by half standard deviation
 - Increase in demand for housing
 - More loan applications, larger loans
 - Change in the composition of housing applications
 - Increase in mortgage applications of higher income, high FICO, and in regions with higher equity holdings
 - Increase in leverage and worse loan performance
 - Loan-to-income and loan-to-value ratios rise, and higher likelihood of delinquency
- Mechanisms: these findings are consistent with attention affects rather than pure wealth effects.

Motivation

- Why should we care?
 - Mortgages are largest household liability and housing is biggest component of leverage (Mian and Sufi 2008)
 - Credit cycles impact real activity and restricting household leverage can improve financial stability and growth (DeFusco et al 2017, Mian et al 2017)
- Why could the stock market movements affect house purchasing decisions?
 - Wealth effects (Davis and Palumbo 2001, Di Maggio et al 2018)
 - Behavioral inattention/round number biases (Lacetera et al 2012, Gabaix 2018)
 - Overweighting front page news (Greenwood and Shleifer 2014, Fedyk 2018)

Contribution

- Factors affect housing demand:
 - Demographics, household income and wealth, credit supply and beliefs about future housing demand (Mian and Sufi 2009; Adelino et al., 2012; Favara and Imbs 2015; Kaplan et al. 2017; Liu et al., 2019)
- Relationship stock market wealth, housing wealth and household consumption:
 - Poterba 2000; Baker et al., 2007; Frydman et al., 2018; Chodorow-Reich et al. 2019; Di Maggio et al. 2020
- Salience and attention:
 - Round numbers effects (Johnson et al. 2007; Bhattacharya et al. 2012; Lacetera et al. 2012)

Roadmap

- Data
 - Dow Jones Index from 1990-2016: aggregate to weekly data
 - Comparison of milestone (treatment) and maximum (control) groups
- Impact of milestone on stock-market awareness
 - TV and Newspapers articles, internet searches and consumer confidence
- Impact of milestone in housing market:
 - Number of loan applications, loan value, and house prices
 - Composition of borrowers (Individual and region)
 - Risk-taking
- Mechanisms
- Conclusion

Data

- Stock-Market Awareness
 - TV mentions (Television News Archive)
 - Internet searches (Google trends)
 - Confidence data (Bloomberg)
 - Newspaper articles (Factiva)
- Housing Demand
 - Mortgage Applications (HMDA)
 - Loan Performance (McDash)
- Other Data
 - Household debt(Consumer Credit Panel-Equifax data)
 - Equity holdings per zip-income (IRS)
 - Demographics (Census)
 - Housing Price data (Corelogic)
 - Car price data (J.D. Power's Power Information Network)

Summary Statistics

| | | | | | | Std. |
|------------------------------------|--------------|---------|------|------|-------|-----------|
| | Observations | Average | p10 | p50 | p90 | Deviation |
| A. Stock Market Variables | | | | | | |
| Max_w | 1,371 | 0.19 | 0.00 | 0.00 | 1.00 | 0.39 |
| $Milestone_w$ | 1,371 | 0.01 | 0.00 | 0.00 | 0.00 | 0.12 |
| PE-Ratio _w | 1,371 | 25.7 | 16.0 | 20.8 | 33.9 | 17.2 |
| DJ Growth Previous Month | 1,371 | 6.0 | -3.9 | 1.0 | 4.5 | 3.7 |
| DJ Growth Following Month | 1,371 | 6.0 | -3.9 | 1.0 | 4.5 | 3.7 |
| B. Macroeconomic Variables | | | | | | |
| $Bullish_w$ | 1,371 | 40.0 | 27.9 | 39.5 | 53 | 9.5 |
| $Misery_m$ | 1,371 | 8.1 | 6.0 | 8.1 | 10.7 | 1.7 |
| Coincident _{s,m} | 16,200 | 90.5 | 72.4 | 90.8 | 106.6 | 14.0 |
| $Leading_{s,m}$ | 16,200 | 1.25 | 0.13 | 1.52 | 2.48 | 1.03 |
| Uncertainty _m | 1,371 | 112 | 67 | 101 | 177 | 45 |
| $Confidence_m$ | 1,371 | 35.8 | 10.0 | 35.0 | 71.0 | 19.5 |
| 30-year Mortgage Rate _m | 1,371 | 5.9 | 3.8 | 6.0 | 7.9 | 1.5 |
| C. Media Variables | | | | | | |
| TV_{w} | 685 | 9.3 | 5.5 | 8.0 | 14.0 | 4.2 |
| $Newspapers_w$ | 403 | 0.1 | 0.0 | 0.1 | 0.2 | 0.1 |
| $Searches_w$ | 1,155 | 63.7 | 32.0 | 63.0 | 94.0 | 26.0 |

| | 01 | | 10 | 50 | 00 | Std. |
|-----------------------------------|--------------|---------|--------|--------|--------|-----------|
| ** . ** . ** | Observations | Average | p10 | p50 | p90 | Deviation |
| Housing Variables | | | | | | |
| EquityHoldings _{z,y} | 86,253,490 | 0.27 | 0.07 | 0.23 | 0.60 | 0.19 |
| $Approval_{i,b,w}$ | 79,548,740 | 85 | 0 | 100 | 100 | 35 |
| AppIncome _{i,b,w} | 86,253,490 | 96 | 34 | 75 | 165 | 90 |
| LoanValue _{i,b,w} | 86,253,490 | 194 | 48 | 155 | 378 | 166 |
| Loan-to-Income _{i,b,w} | 86,253,490 | 224 | 75 | 217 | 375 | 114 |
| HomeValue _{i,b,w} | 13,112,546 | 325 | 110 | 240 | 594 | 517 |
| Loan-to-Value _{i,b,w} | 13,112,546 | 79 | 60 | 80 | 95 | 14 |
| Non-Conventional _{i,b,w} | 13,112,546 | 34.2 | 0.0 | 0.0 | 100.0 | 47.4 |
| $FICO_{i,b,w}$ | 10,014,270 | 723 | 630 | 735 | 795 | 62 |
| Late _{i,b,w} | 9,245,079 | 5.0 | 0.0 | 0.0 | 0.0 | 21.7 |
| Late-HighFICO _{i,b,w} | 4,396,359 | 1.1 | 0.0 | 0.0 | 0.0 | 10.3 |
| HousePriceIndex _{z,m} | 485,800 | 99.0 | 132.0 | 215.3 | 45.7 | 21.7 |
| Car-Market Variables | | | | | | |
| CarSales _m | 956 | 1,580 | 991 | 1,558 | 2,162 | 441 |
| PriceNewCar _m | 956 | 29,772 | 28,629 | 29,726 | 31,079 | 1,013 |
| PriceUsedCar _m | 956 | 17,231 | 16,341 | 17,168 | 18,295 | 737 |
| Purchases _m | 956 | 24.5 | 17 | 25 | 32 | 5.4 |
| Cash _m | 956 | 79.5 | 71 | 80 | 87 | 5.4 |

SMU Classification: Restricted

Stock-Market Movement: Awareness and Confidence

Stock Market Movements

TV Mentions, Internet Searches, Consumer Confidence

Specification

$$Y_t = \sum_{w} \theta_{max,w} Max_{w,t} + \sum_{w} \theta_{ms,w} MS_{w,t} + X_t + Qrt + \varepsilon_t$$

Y_t - Mentions/Searches/Confidence in week *t*

 $Max_{w,t}$ - Dummy of a maximum w weeks to/from week t

 $MS_{w,t}$ - Dummy of a milestone w weeks to/from week t

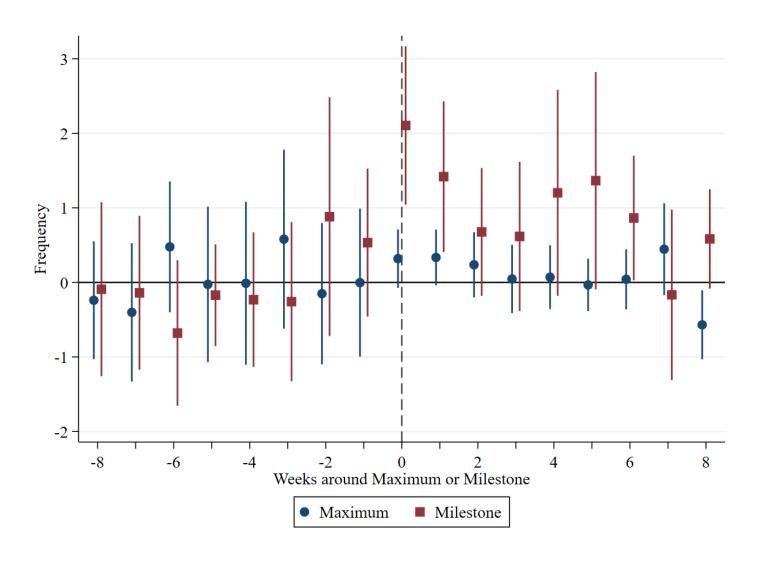
 X_t - Stock-market and macro controls at time t

Qtr - Quarter fixed effects

- Milestone is also a maximum: $\theta_{ms,w}$ capture the additional effect of milestone
- Robust standard errors

Impact of Maximum and Milestones

News paper articles on "Stock Market"



Milestones and media exposure

| | Newspapers _w | TV_{w} | $Searches_w$ | $Bullish_w$ |
|--|-------------------------|----------|--------------|-------------|
| | (1) | (2) | (3) | (4) |
| D., \$1.60 | E 1444 | 0.00 | 0.08 | 2.54* |
| Pre _{5w-6w} *MS _w | -5.14** | 0.00 | -0.08 | 2.54* |
| | (2.49) | (0.02) | (0.39) | (1.47) |
| $Pre_{3w-4w}*MS_w$ | -1.61 | 0.01 | -0.65 | 1.90 |
| | (2.02) | (0.02) | (0.40) | (1.54) |
| $Pre_{1w-2w}*MS_w$ | 2.08 | -0.01 | 0.39 | 0.69 |
| | (3.05) | (0.02) | (0.64) | (1.53) |
| Max_w*MS_w | 9.33*** | 0.08*** | 0.80*** | 2.67* |
| | (2.71) | (0.03) | (0.31) | (1.55) |
| Post _{1w-2w} *MS _w | 5.61** | -0.00 | 0.35 | 3.61** |
| | (2.48) | (0.02) | (0.40) | (1.69) |
| Post _{3w-4w} *MS _w | 5.44* | 0.03 | 0.52 | 2.33* |
| | (3.10) | (0.02) | (0.45) | (1.39) |
| Post _{5w-6w} *MS _w | 7.80** | 0.09*** | -0.03 | 3.03** |
| | (3.17) | (0.03) | (0.34) | (1.53) |
| Post _{7w-8w} *MS _w | 1.89 | -0.00 | -0.65** | 1.36 |
| | (2.39) | (0.02) | (0.30) | (1.30) |
| Post _{9w-10w} *MS _w | 1.17 | 0.05*** | 0.12 | -0.41 |
| | (2.24) | (0.02) | (0.48) | (1.25) |
| Post _{11w-12w} *MS _w | 0.62 | 0.03* | 0.23 | -1.76 |
| | (2.44) | (0.02) | (0.30) | (1.27) |
| Observations | 1,115 | 415 | 697 | 1,113 |
| R-squared | 0.66 | 0.28 | 0.62 | 0.41 |
| Macro Controls | Yes | Yes | Yes | Yes |
| Quarter FE Average Dependent | Yes | Yes | Yes | Yes |
| Variable | 9.3 | 0.1 | 63.7 | 40.0 |

SMU Classification: Restricted

Impact on Debt and Mortgage Market

Stock Market Movements

Impact on Mortgage Market

- In this section, we ask
- Do stock milestones impact household debt and mortgage demand?
 - Extensive margin: loan applications, second home
 - Intensive margin: loan value
- Does the impact depend on exposure to stock markets?
- Do stock milestones affect the borrowers' composition, risk-taking, and loan performance?

Impact of milestones on household debt

| | Credit _{i,q} | | | Revolving Credit _{i,q} | | | |
|------------------------------------|-----------------------|-----------|-----------|---------------------------------|-----------|-----------|--|
| | (1) | (2) | (3) | (4) | (5) | (6) | |
| | | | | | | | |
| Pre _{1q} *MS _q | -0.28 | -0.30 | 0.20 | 0.88 | 0.91 | 1.45 | |
| | (0.85) | (1.10) | (1.22) | (0.63) | (0.80) | (0.99) | |
| Max _q *MS _q | 1.93* | 2.43* | 2.00 | 2.77*** | 2.98*** | 2.97*** | |
| | (1.05) | (1.25) | (1.46) | (1.00) | (1.09) | (1.12) | |
| $Post_{1q}*MS_q$ | 0.95 | 1.76 | 2.22* | 0.78 | 1.16 | 1.47 | |
| | (1.21) | (1.31) | (1.32) | (1.00) | (1.09) | (0.99) | |
| Observations | 9,824,110 | 9,774,309 | 7,797,229 | 9,824,110 | 9,774,309 | 7,797,229 | |
| R-squared | 0.18 | 0.92 | 0.92 | 0.19 | 0.94 | 0.94 | |
| Macro Controls | Yes | Yes | Yes | Yes | Yes | Yes | |
| Zip*Year FE | Yes | - | - | Yes | - | - | |
| Borrower*Year FE | No | Yes | Yes | No | Yes | Yes | |
| Borrowers | All | All | FICO>580 | All | All | FICO>580 | |

Stock Market Movements

Impact on Mortgage Market - Specification

Specification

$$Y_{i,z,b,t} = \alpha + \sum_{w} \theta_{max,w} Max_{w,t} + \sum_{w} \theta_{ms,w} MS_{w,t} + X_t + Zip*Qtr + Bank*Qtr + \varepsilon_{i,z,b,t}$$

 $Y_{i,z,b,t}$ - loan value *i*, in Zip *z*, by bank *b*, in week *t*

 $Max_{w,t}$ - Dummy of a maximum w weeks to/from week t

 MS_{wt} - Dummy of a milestone w weeks to/from week t

 X_t - Stock-market and macro controls at time t

*Zip*Qtr* - Zip*Quarter fixed-effects

Bank*Qtr - Bank*Quarter fixed-effects

• Milestone is also a maximum: $\theta_{ms,w}$ capture the additional effect of milestone

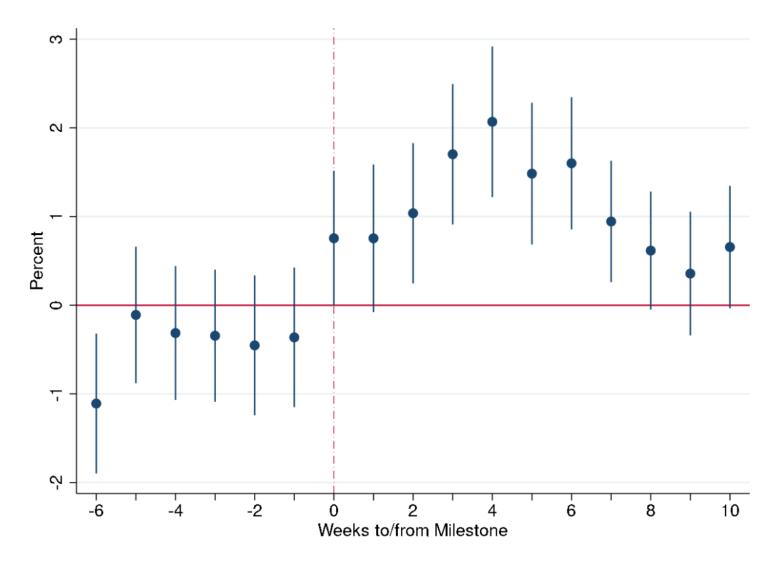
Extensive margin: number of mortgage

| | | Numbe | erLoans _{w,g} | |
|-------------------------------------|-------------|-------------|------------------------|------------|
| | (1) | (2) | (3) | (4) |
| Pre _{2m} *MS _m | 0.01 | 0.02 | 0.00 | 0.00 |
| Tic _{2m} Wis _m | (0.03) | (0.03) | (0.03) | (0.03) |
| Pre _{1m} *MS _m | -0.01 | -0.00 | -0.04* | -0.04* |
| ···· | (0.03) | (0.03) | (0.03) | (0.03) |
| Max _m *MS _m | 0.08* | 0.09* | -0.02 | -0.02 |
| | (0.05) | (0.05) | (0.03) | (0.03) |
| Post _{1m} *MS _m | 0.11* | 0.11* | -0.03 | -0.03 |
| | (0.06) | (0.06) | (0.03) | (0.03) |
| Post _{2m} *MS _m | -0.01 | -0.00 | -0.00 | -0.01 |
| | (0.05) | (0.05) | (0.03) | (0.03) |
| Post _{3m} *MS _m | 0.11*** | 0.11** | 0.03* | 0.03 |
| | (0.04) | (0.04) | (0.02) | (0.02) |
| Observations | 975 | 975 | 851 | 851 |
| R-squared | 0.97 | 0.97 | 0.92 | 0.92 |
| Year FE | Yes | Yes | Yes | Yes |
| Weekly Controls | No | Yes | No | Yes |
| Sample | High Equity | High Equity | Low Equity | Low Equity |

Intensive margin: Sample in zips with high equity holdings

| | Loan Amount _{i,b,w} | Second Homei,b,w | Home Value _{i,b,w} |
|--|------------------------------|------------------|-----------------------------|
| | (1) | . (2) | (3) |
| Pre _{5w-6w} *MS _w | -1.10*** | 0.07 | 0.11 |
| | (0.42) | (0.14) | (0.33) |
| Pre _{3w-4w} *MS _w | -0.52 | 0.17 | -0.22 |
| | (0.34) | (0.15) | (0.33) |
| Pre _{1w-2w} *MS _w | -0.39 | 0.32* | 0.02 |
| | (0.36) | (0.17) | (0.31) |
| Max _w *MS _w | 0.07 | 0.37*** | 0.50* |
| | (0.41) | (0.12) | (0.31) |
| Post _{1w-2w} *MS _w | 0.51 | 0.35*** | 0.14 |
| | (0.41) | (0.12) | (0.32) |
| Post _{3w-4w} *MS _w | 1.05** | 0.38*** | 0.25 |
| | (0.47) | (0.10) | (0.36) |
| Post _{5w-6w} *MS _w | 0.99** | 0.33*** | 0.52* |
| | (0.41) | (0.11) | (0.34) |
| Post _{7w-8w} *MS _w | 0.44 | 0.39*** | 0.43 |
| | (0.39) | (0.08) | (0.35) |
| Post _{9w-10w} *MS _w | 0.23 | 0.44*** | 0.39 |
| | (0.42) | (0.10) | (0.33) |
| Post _{11w-12w} *MS _w | -0.02 | 0.35*** | 0.55* |
| | (0.49) | (0.08) | (0.33) |
| Observations | 62,857,797 | 62,857,797 | 6,871,703 |
| R-squared | 0.17 | 0.40 | 0.37 |
| Macro Controls | Yes | Yes | Yes |
| MSA*Year FE | Yes | Yes | Yes |
| Bank*Year FE | Yes | Yes | Yes |

Intensive margin: Sample in zips with high equity holdings



Milestone and Mortgage Application Composition of Borrowers

- Is the composition of mortgage applicants affected by the milestone?
 - Income of applicants
 - FICO
- Does the risk-taking of mortgage applicants affected by milestones?
 - Loan to value
 - Interest rate
 - Delinquencies

Stock Market Movements

Impact on Mortgage Market - Specification

Specification

$$Y_{i,m,b,t} = \alpha + \sum_{w} \theta_{max,w} Max_{w,t} + \sum_{w} \theta_{ms,w} MS_{w,t} + X_{t} + Zip*Qtr + Bank*Qtr + \varepsilon_{i,m,b,t}$$

 $Y_{i,m,b,t}$ - Characteristics of borrower *i* in region *m* of a loan given by bank *b*, in week *t*

 $Max_{w,t}$ - Dummy of a maximum w weeks to/from week t

 $MS_{w,t}$ - Dummy of a milestone w weeks to/from week t

 X_t - Stock-market and macro controls at time t

*Zip*Qtr* - Zip*Quarter fixed-effects

Bank*Qtr - Bank*Quarter fixed-effects

• Milestone is also a maximum: $\theta_{ms,w}$ capture the additional effect of milestone

Risk characteristics of loans (loan-to-value ratio)

| | Applicant Income _{i,b,w} | FICO _{i,b,w} | High LTV _{i,b,w} | Interest Rate _{i,b,w} | Default _{i,b,w} |
|--|-----------------------------------|-----------------------|---------------------------|--------------------------------|--------------------------|
| | (1) | (2) | (3) | (4) | (5) |
| | | | | | |
| $Pre_{5w-6w}*MS_w$ | 0.26 | 0.78 | -0.10 | 0.02 | 0.06 |
| | (0.30) | (0.48) | (0.41) | (0.02) | (0.08) |
| Pre _{3w-4w} *MS _w | 0.43 | 0.40 | -0.03 | 0.02 | 0.23 |
| | (0.32) | (0.54) | (0.32) | (0.02) | (0.16) |
| $Pre_{1w-2w}*MS_w$ | 0.04 | 0.93* | -0.18 | 0.04* | 0.25 |
| | (0.25) | (0.50) | (0.28) | (0.02) | (0.20) |
| Max _w *MS _w | -0.13 | 1.23*** | 0.22 | 0.02** | 0.20** |
| | (0.22) | (0.47) | (0.35) | (0.01) | (0.08) |
| Post _{1w-2w} *MS _w | 0.15 | 1.17** | 0.67* | 0.02** | 0.26*** |
| | (0.18) | (0.52) | (0.39) | (0.01) | (0.08) |
| Post _{3w-4w} *MS _w | 0.33* | 1.07** | 1.03** | 0.02** | 0.27*** |
| | (0.20) | (0.46) | (0.42) | (0.01) | (0.07) |
| Post5w-6w*MSw | 0.42*** | 0.62 | 0.91** | 0.02** | 0.32*** |
| | (0.16) | (0.47) | (0.38) | (0.01) | (0.09) |
| Post _{7w-8w} *MS _w | 0.29* | 0.47 | 0.98** | 0.01 | 0.32*** |
| | (0.16) | (0.36) | (0.40) | (0.01) | (0.07) |
| Post _{9w-10w} *MS _w | 0.25 | 0.42 | 0.93*** | 0.01 | 0.39*** |
| | (0.18) | (0.29) | (0.35) | (0.01) | (0.10) |
| Post _{11w-12w} *MS _w | 0.25 | -0.29 | -0.03 | 0.02** | 0.30*** |
| | (0.17) | (0.36) | (0.44) | (0.01) | (0.07) |
| Observations | 62,857,797 | 6,871,703 | 8,090,364 | 8,143,307 | 2,553,882 |
| R-squared | 0.26 | 0.15 | 0.07 | 0.79 | 0.07 |
| Macro Controls | Yes | Yes | Yes | Yes | Yes |
| MSA*Year FE | Yes | Yes | Yes | Yes | Yes |
| Bank*Year FE | Yes | Yes | Yes | Yes | Yes |

Impact on car market

| | CarSales _w | PriceNewCar _w | Purchasesw | Cashw | PriceUsedCar _w |
|-------------------------------------|-----------------------|--------------------------|------------|--------|---------------------------|
| | (1) | (2) | (3) | (4) | (5) |
| | | | | | |
| $Pre_{3m}*MS_{m}$ | 0.05 | 0.33 | 0.21 | -0.06 | -0.86** |
| | (0.06) | (0.26) | (0.17) | (0.21) | (0.36) |
| $Pre_{2m}^*MS_m$ | 0.13* | 0.36 | 0.11 | -0.33 | -0.39 |
| | (0.07) | (0.27) | (0.23) | (0.21) | (0.36) |
| $Pre_{1m}^*MS_m$ | 0.08 | 0.29 | 0.08 | 0.17 | -0.07 |
| ••••• | (0.07) | (0.30) | (0.18) | (0.21) | (0.36) |
| Max_m*MS_m | 0.14*** | 0.74*** | 0.36** | 0.20 | 0.27 |
| | (0.05) | (0.25) | (0.17) | (0.19) | (0.36) |
| Post _{1m} *MS _m | 0.12* | 0.70** | 0.41* | 0.43* | 0.21 |
| ••••• | (0.07) | (0.30) | (0.21) | (0.23) | (0.47) |
| $Post_{2m}*MS_m$ | 0.14** | 0.08 | 0.45** | 0.24 | -0.15 |
| | (0.07) | (0.26) | (0.20) | (0.22) | (0.46) |
| Post _{3m} *MS _m | -0.01 | 0.32 | 0.47** | 0.17 | -1.32*** |
| • | (0.06) | (0.24) | (0.21) | (0.22) | (0.41) |
| Observations | 730 | 938 | 938 | 938 | 878 |
| R-squared | 0.57 | 0.80 | 0.95 | 0.93 | 0.82 |
| Controls | Yes | Yes | Yes | Yes | Yes |
| Quarter FE | Yes | Yes | Yes | Yes | Yes |
| Avg(Dependent | | | | | 32 |
| Variable) | - | - | 79.5 | 24.5 | <u>-</u> |

Summary

- Stock market milestones
 - Increase in demand for housing
 - More loan applications, more likely to be second home, larger loans
 - Change in the composition of housing applications
 - Increase in mortgage applications of higher income, higher FICO, and in regions with higher equity holdings
 - Increase in leverage and worse loan performance
 - Loan-to-income and loan-to-value ratios rise, and higher likelihood of delinquency
 - Increase housing price index

SMU Classification: Restricted

Mechanisms

1. Wealth effect vs attention effect

- Wealth effect: Stock market milestones indicating historical maxima increase equity holders' wealth. With larger amounts of wealth, equity holders tend to buy houses, increasing mortgage demand.
- Attention effect: Stock market milestone is an attention-grabbing event,
 reminding equity holders about wealth increase.

- The attention effect amplify the wealth effect:
 - Implication: milestone events would have larger effects on housing demand than other historical maximum events

Recall: Difference between milestone event and non-milestone historical maximum

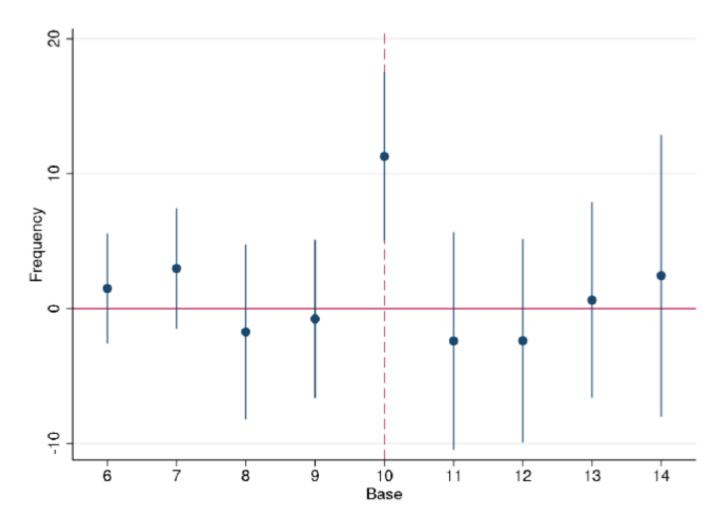
Attention effect

• The additional effect of milestone event while controlling for the effect of non-milestone historical maximum event is attention effect.

| | TV_{w} | Newspapers _w | Searches _w | $\operatorname{Bullish}_{\operatorname{w}}$ |
|--|-------------------|-------------------------|-----------------------|---|
| | (1) | (2) | (3) | (4) |
| Pre _{5w-6w} *MS _w | -5.14** | 0.00 | -0.08 | 2.54* |
| 5w-0w w | (2.49) | (0.02) | (0.39) | (1.47) |
| Pre _{3w-4w} *MS _w | -1.61 | 0.01 | -0.65 | 1.90 |
| JW-TW W | (2.02) | (0.02) | (0.40) | (1.54) |
| Pre _{1w-2w} *MS _w | 2.08 | -0.01 | 0.39 | 0.69 |
| 1 | (3.05) | (0.02) | (0.64) | (1.53) |
| Max _w *MS _w | 9.33*** | 0.08*** | 0.80*** | 2.67* |
| | (2.71) | (0.03) | (0.31) | (1.55) |
| Post _{1w-2w} *MS _w | 5.61** | -0.00 | 0.35 | 3.61** |
| | (2.48) | (0.02) | (0.40) | (1.69) |
| Post _{3w-4w} *MS _w | 5.44* | 0.03 | 0.52 | 2.33* |
| | (3.10) | (0.02) | (0.45) | (1.39) |
| Post _{5w-6w} *MS _w | 7.80** | 0.09*** | -0.03 | 3.03** |
| | (3.17) | (0.03) | (0.34) | (1.53) |
| Post _{7w-8w} *MS _w | 1.89 | -0.00 | -0.65** | 1.36 |
| | (2.39) | (0.02) | (0.30) | (1.30) |
| Post _{9w-10w} *MS _w | 1.17 | 0.05*** | 0.12 | -0.41 |
| | (2.24) | (0.02) | (0.48) | (1.25) |
| Post _{11w-12w} *MS _w | 0.62 | 0.03* | 0.23 | -1.76 |
| | (2.44) | (0.02) | (0.30) | (1.27) |
| Observations | 1,115 | 415 | 697 | 1,113 |
| R-squared | 0.66 | 0.28 | 0.62 | 0.41 |
| Macro Controls | Yes | Yes | Yes | Yes |
| Quarter FE | Yes | Yes | Yes | Yes |
| Average Dependent Variable | 9.3 | 0.1 | 63.7 | 40.0 |

Difference between milestone event and non-milestone historical maximum

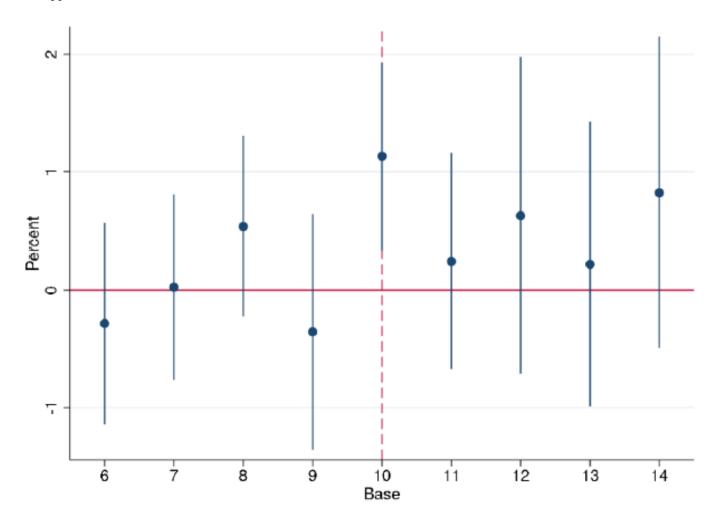
Attention effect: Milestone and media exposure - Placebo



Note: In base 9, the first round number "1000" is $9^3 = 729$ in base 10. In base 11, the first round number "1000" is $11^3 = 1331$ in base 10.

Difference between milestone event and non-milestone historical maximum

Attention effect: Milestone and loan value - Placebo



Note: In base 9, the first round number "1000" is $9^3 = 729$ in base 10. In base 11, the first round number "1000" is $11^3 = 1331$ in base 10.

- 2. Other policies: Interest rate expectation and macro prediction
- The stock milestone might be corelated with the change in expectations
 of interest rate or macroeconomics affects housing demand.
- Two additional tests:
- If our results are driven by the stock market, the increase in stock market should have different impact on households with varying degrees of exposure to the stock market.
 - · We show it is driven by zips with high equity holdings
- The expectation of future interest should also affect home refinance
 - We show that there is no effect on refinance

Recall: Impact of milestones on housing market

Extensive margin: number of mortgage

| | | NumberLoans _{w,g} | | | | |
|-------------------------------------|-------------|----------------------------|------------|------------|--|--|
| | (1) | (2) | (3) | (4) | | |
| | | | | | | |
| Pre _{2m} *MS _m | 0.01 | 0.02 | 0.00 | 0.00 | | |
| | (0.03) | (0.03) | (0.03) | (0.03) | | |
| Pre _{1m} *MS _m | -0.01 | -0.00 | -0.04* | -0.04* | | |
| | (0.03) | (0.03) | (0.03) | (0.03) | | |
| Max _m *MS _m | 0.08* | 0.09* | -0.02 | -0.02 | | |
| | (0.05) | (0.05) | (0.03) | (0.03) | | |
| Post _{1m} *MS _m | 0.11* | 0.11* | -0.03 | -0.03 | | |
| | (0.06) | (0.06) | (0.03) | (0.03) | | |
| Post _{2m} *MS _m | -0.01 | -0.00 | -0.00 | -0.01 | | |
| | (0.05) | (0.05) | (0.03) | (0.03) | | |
| Post _{3m} *MS _m | 0.11*** | 0.11** | 0.03* | 0.03 | | |
| | (0.04) | (0.04) | (0.02) | (0.02) | | |
| Observations | 975 | 975 | 851 | 851 | | |
| R-squared | 0.97 | 0.97 | 0.92 | 0.92 | | |
| Year FE | Yes | Yes | Yes | Yes | | |
| Weekly Controls | No | Yes | No | Yes | | |
| Sample | High Equity | High Equity | Low Equity | Low Equity | | |

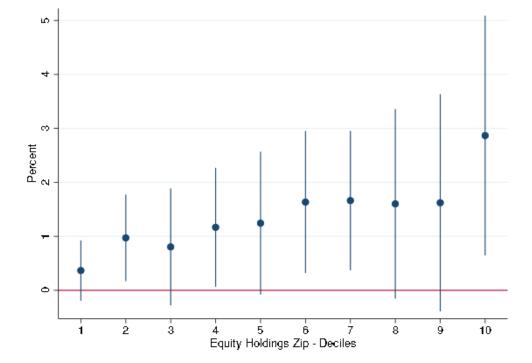
Difference between milestone event and non-milestone historical maximum

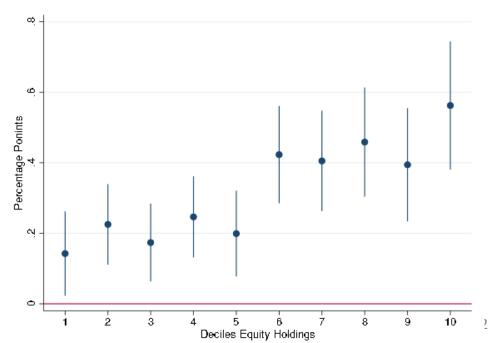
Mortgage applicants: equity holders

| | Equity Holdings _{i,b,w} | | | | |
|---|----------------------------------|------------|------------|------------|------------|
| | (1) | (2) | (3) | (4) | (5) |
| Pre _{5w-6w} *MS _w | -0.05 | -0.07 | -0.07 | -0.01 | 0.01 |
| 1123W-6W 1112W | (0.06) | (0.06) | (0.08) | (0.04) | (0.04) |
| Pre _{3w-4w} *MS _w | 0.01 | 0.01 | -0.00 | 0.02 | -0.04 |
| 1103 _W -4 _W 1115 _W | (0.05) | (0.05) | (0.05) | (0.05) | (0.04) |
| Pre _{1w-2w} *MS _w | 0.02 | 0.02 | -0.03 | -0.05 | -0.08 |
| TO _{1W-2W} TVIO _W | (0.07) | (0.06) | (0.07) | (0.05) | (0.05) |
| Max _w *MS _w | 0.06 | 0.05 | -0.01 | -0.02 | -0.01 |
| Wally Was | (0.08) | (0.08) | (0.07) | (0.05) | (0.05) |
| Post _{1w-2w} *MS _w | 0.23*** | 0.17** | 0.14* | 0.08 | 0.08* |
| T GSt IW-2W TVISW | (0.08) | (0.07) | (0.07) | (0.05) | (0.04) |
| Post _{3w-4w} *MS _w | 0.31*** | 0.25*** | 0.21*** | 0.12** | 0.12*** |
| 1 0 5 3 W - 4 W | (0.08) | (0.08) | (0.07) | (0.05) | (0.04) |
| Post _{5w-6w} *MS _w | 0.28*** | 0.25*** | 0.19*** | 0.12** | 0.09* |
| 0005W-6W 1112W | (0.06) | (0.07) | (0.07) | (0.05) | (0.05) |
| Post _{7w-8w} *MS _w | 0.21*** | 0.19*** | 0.11* | 0.10** | 0.06 |
| 1.12W | (0.06) | (0.07) | (0.06) | (0.04) | (0.05) |
| Post _{9w-10w} *MS _w | 0.12** | 0.09 | 0.02 | 0.04 | 0.01 |
| 105 10W 1115W | (0.05) | (0.06) | (0.06) | (0.05) | (0.05) |
| Post _{11w-12w} *MS _w | 0.22*** | 0.20*** | 0.13* | 0.09** | 0.02 |
| 1 05t[] _W -12 _W 1125 _W | (0.06) | (0.06) | (0.07) | (0.05) | (0.05) |
| Observations | 62,131,007 | 62,131,007 | 62,130,144 | 62,113,854 | 30,371,906 |
| R-squared | 0.16 | 0.16 | 0.18 | 0.26 | 0.24 |
| Macro Controls | No | Yes | Yes | Yes | Yes |
| MSA FE | Yes | Yes | - | - | - |
| Year FE | Yes | Yes | _ | _ | _ |
| MSA*Year FE | No | No | Yes | Yes | Yes |
| Bank*Year FE | No | No | No | Yes | Yes |
| Borrower Controls | No | No | No | Yes | Yes |
| Applicant Income | All | All | All | All | >\$75,000 |
| Average(EquityHoldings; b, w) | 27.1 | 27.1 | 27.1 | 27.1 | 40.2 |

Home Equity Loan: Results driven by zips with high equity holdings

Second Home Application: Results driven by zips with high equity holdings





Difference between milestone event and non-milestone historical maximum

Mortgage mortgage loan value for refinancing

| | Loan Amount _{i,b,w} | | | |
|--|------------------------------|-------------|-------------|-------------|
| | (1) | (2) | (3) | (4) |
| | | | | |
| Pre _{5w-6w} *MS _w | -1.00 | -0.26 | -0.24 | -0.08 |
| | (0.83) | (0.61) | (0.60) | (0.41) |
| Pre _{3w-4w} *MS _w | -2.54 | -0.55 | -0.49 | 0.08 |
| | (1.86) | (0.80) | (0.85) | (0.51) |
| Pre _{1w-2w} *MS _w | -1.89** | -0.71 | -0.65 | 0.17 |
| | (0.87) | (0.65) | (0.71) | (0.45) |
| Max _w *MS _w | -2.26** | -0.87 | -0.87 | -0.28 |
| | (0.90) | (0.71) | (0.78) | (0.47) |
| Post _{lw-2w} *MS _w | -2.52*** | -0.94 | -0.95 | -0.31 |
| | (0.96) | (0.61) | (0.68) | (0.50) |
| Post _{3w-4w} *MS _w | -1.95* | 0.33 | 0.21 | 0.35 |
| 20.00 | (1.03) | (0.69) | (0.76) | (0.56) |
| Post _{5w-6w} *MS _w | -2.33** | -0.19 | -0.15 | 0.13 |
| 1 0 0 0 W 1/1 0 W | (1.04) | (0.63) | (0.71) | (0.45) |
| Post _{7w-8w} *MS _w | -2.14* | -0.17 | -0.16 | 0.26 |
| | (1.22) | (0.79) | (0.87) | (0.55) |
| Post _{9w-10w} *MS _w | -1.61 | -0.17 | -0.09 | 0.28 |
| | (1.05) | (0.73) | (0.79) | (0.45) |
| Post _{11w-12w} *MS _w | -1.08 | 0.06 | 0.15 | 0.05 |
| | (1.03) | (0.68) | (0.71) | (0.39) |
| Observations | 124,471,259 | 124,471,259 | 124,471,186 | 120,398,330 |
| R-squared | 0.26 | 0.26 | 0.27 | 0.42 |
| Controls | Yes | Yes | Yes | Yes |
| MSA FE | Yes | Yes | - | - |
| Time FE | Yes | Yes | - | - |
| MSA*Time FE | No | No | Yes | Yes |
| Bank*Time FE | No | No | No | Yes |

3. Bank credit supply and demand

HMDA data include both loan application and loan approval

| | | $Approval_{i,b,w}$ | | | |
|--|------------|--------------------|------------|------------|--|
| | (1) | (2) | (3) | (4) | |
| Pre _{5w-6w} *MS _w | -0.71** | -0.45** | -0.36 | -0.50** | |
| | (0.32) | (0.20) | (0.24) | (0.22) | |
| Pre _{3w-4w} *MS _w | -0.45 | -0.53* | -0.62** | -0.50* | |
| | (0.37) | (0.29) | (0.29) | (0.30) | |
| $Pre_{1w-2w}*MS_w$ | -0.38 | -0.47* | -0.38 | -0.48 | |
| | (0.41) | (0.28) | (0.33) | (0.30) | |
| Max _w *MS _w | -0.23 | -0.20 | 0.02 | -0.33 | |
| | (0.43) | (0.27) | (0.30) | (0.27) | |
| Post _{1w-2w} *MS _w | -0.11 | -0.22 | 0.11 | -0.39** | |
| | (0.35) | (0.16) | (0.20) | (0.16) | |
| Post _{3w-4w} *MS _w | 0.01 | -0.39*** | -0.06 | -0.56*** | |
| | (0.37) | (0.15) | (0.22) | (0.15) | |
| Post _{5w-6w} *MS _w | 0.42 | -0.17 | 0.05 | -0.32** | |
| | (0.30) | (0.13) | (0.21) | (0.15) | |
| Post _{7w-8w} *MS _w | 0.24 | -0.31* | -0.34 | -0.31* | |
| | (0.27) | (0.16) | (0.23) | (0.18) | |
| Post _{9w-10w} *MS _w | 0.13 | -0.38* | -0.26 | -0.46** | |
| | (0.23) | (0.22) | (0.26) | (0.23) | |
| Post _{11w-12w} *MS _w | 0.03 | 0.20 | 0.17 | 0.24 | |
| | (0.19) | (0.21) | (0.22) | (0.22) | |
| Observations | 62,267,349 | 62,197,018 | 62,435,503 | 59,701,120 | |
| R-squared | 0.07 | 0.25 | 0.31 | 0.18 | |
| Controls | Yes | Yes | Yes | Yes | |
| MSA FE | Yes | Yes | - | - | |
| Time FE | Yes | Yes | - | - | |
| MSA*Time FE | No | No | Yes | Yes | |
| Bank*Time FE | No | No | No | Yes | |

Conclusion

- Crossing milestones increase demand for housing in the extensive and intensive margin
- Composition of borrowers:
 - Have high equity holdings, high income, and high FICO scores
 - Are riskier with higher interest rate, LTV, and DTI, and more likely to default in the two years after loan originations.
- Increase in housing demand leads to rise in housing price
- These findings are consistent with attention affects rather than pure wealth effects.
 - Stock-market milestones increase news and awareness on equity performance

Appendix

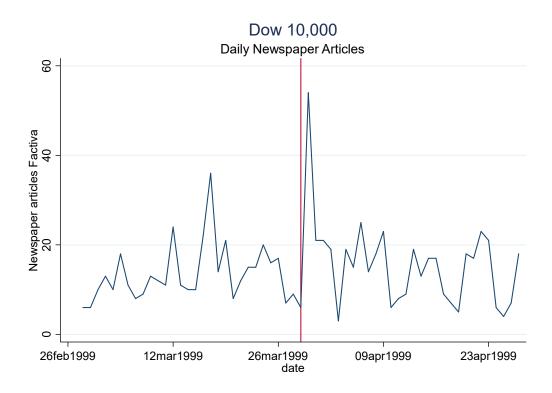
| Mentions in Media | |
|--------------------------------|--|
| | Number of mentions in week w for mentions of "Dow Jones Industrial Average" and related |
| Newspapers _w | queries, for six newspapers (Boston Globe, Chicago Tribune, New York Times, Wall Street |
| | Journal, LA Times, and Washington Post). Data obtained from ProQuest. |
| TV_{w} | Frequency of mentions in week w in CNN, Fox, and MSNBC of the terms "Stock Market" or |
| 1 V W | "Dow". Data obtained from GDELT Project. |
| Searchesw | Frequency of searches in of the term "Stock Market" or "Dow" in week w. Data obtained from |
| | Google Trends |
| Stock Market Vari | |
| Max_{w} | Indicator that the Dow-Jones Index reached an historical maximum in week w. |
| MS_{w} | Indicator that the Dow-Jones Index reached a maximum and a milestone in week w. |
| PE-Ratio _w | Price-to-Earnings ratio of Dow-Jones index in week w |
| $PreGrowth-z_w$ | Growth rate of the Dow-Jones Index in week w over the previous z weeks. |
| PostGrowth- z_w | Growth rate of the Dow-Jones Index in week w over the following z weeks. |
| $Equity_{m,y}$ | Share of households in MSA m in year y that have taxable returns from equities, from IRS. |
| Housing Variables | |
| Approvaliby | Indicator of whether loan application i made to bank b in week w was approved. Data obtained from HMDA. |
| AppIncomeibw | Household income of applicant of loan i to bank b in week w (in logs). Data collected from HMDA. |
| LoanValue _{ib.w} | Value of the loan i extended by bank b in week w (in logs). Data collected from HMDA. |
| Loan-to-Incomeibw | Ratio of loan to income of loan i extended by bank b in week w . Data collected from HMDA. |
| Non- | |
| Conventional Lbw | Indicator of loan with less than 20 percent of down payment |
| Lateitus | Indicator that \underline{loan} i extended by bank b in week \underline{w} will become delinquent within two years of its origination. |
| Late-HighFICO _{ibw} | Indicator of loan late in the 2 years following start for individuals FICO above 720 |
| HomeValue _{ibw} | Appraisal value of the home of loan i extended by bank b in week w (in logs). Data obtained from McDash. |
| HousePriceIndex _{z,m} | Repeat sales, value weighted, econometric Home Price Model Index of zipcode z in month m obtained from CoreLogic. |
| Equifax Variables | |
| Credit _{i.m} | Total outstanding credit (in logs) of individual i in quarter q . It is the sum of mortgage loan, home- |
| XXXXXX | equity loan, HELOC, credit card, auto loan and retail credit. |
| Revolving Creditim | Total revolving credit (in logs) of individual i in quarter q . It is the sum of HELOC, credit card debt, and retail credit. |

Stock-Market Movements: House Prices

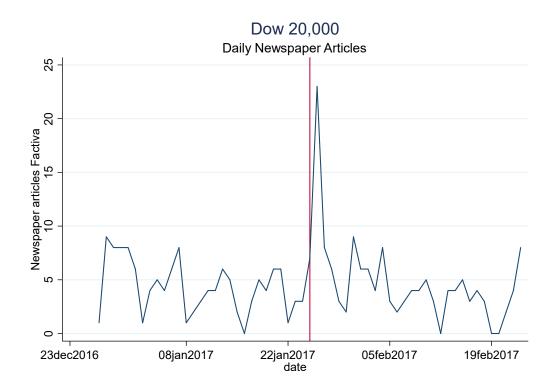
- If there is an increase in demand for housing, we should observe an increase in prices
- We use monthly information on prices from CoreLogic
- Information is at the month-zipcode level
- Specification as before, but controls and coefficients at monthly frequency

| | HousePriceIndexzm | | | |
|------------------------------------|-------------------|------------|------------|-------------|
| | (1) | (2) | (3) | (4) |
| Pre _{1m} *MS _m | -0.16 | -0.38 | -0.18 | -0.07 |
| | (0.47) | (0.58) | (0.47) | (0.44) |
| Max _m *MS _m | 0.55* | 0.65* | 0.58* | 0.48 |
| | (0.32) | (0.39) | (0.32) | (0.31) |
| $Post_{1m}*MS_m$ | 0.15 | 0.12 | 0.15 | 0.16 |
| | (0.36) | (0.41) | (0.36) | (0.35) |
| Observations | 330,537 | 43,259 | 142,205 | 145,073 |
| R-squared | 1.00 | 1.00 | 1.00 | 1.00 |
| Controls | Yes | Yes | Yes | Yes |
| Zip-Year FE | Yes | Yes | Yes | Yes |
| Sample | All | Low Equity | Mid Equity | High Equity |

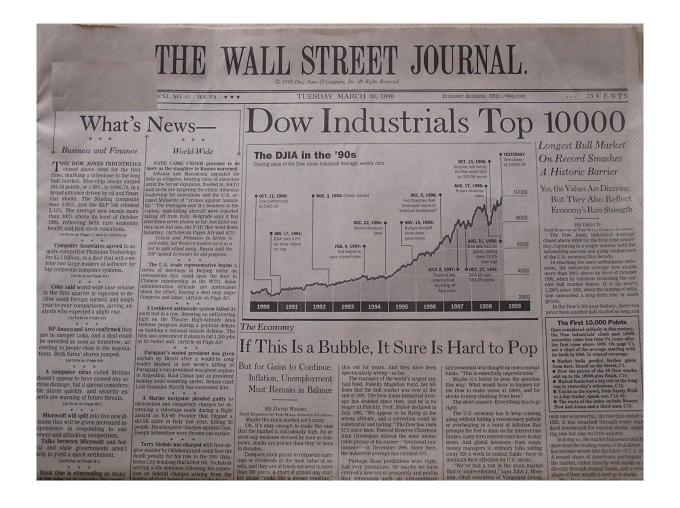
Dow 10,000



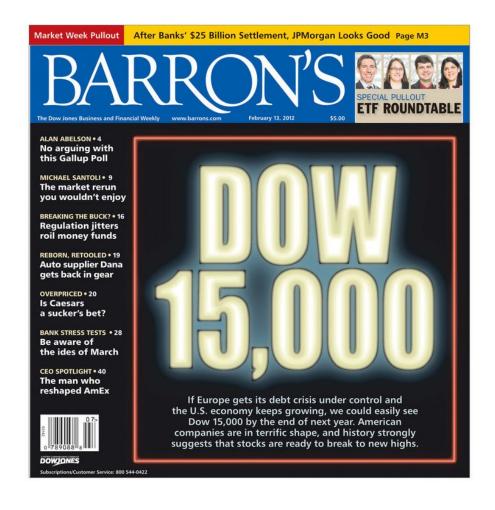
Dow 20,000



Dow 10,000



Dow 15,000



Dow 20,000

THE WALL STREET JOURNAL.



Dow 20,000



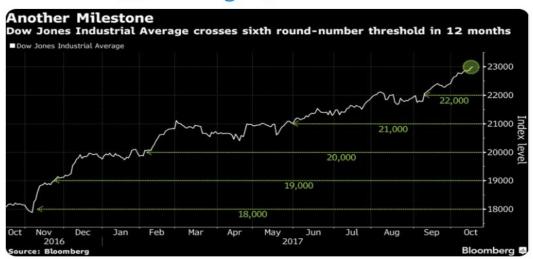
Dow 23,000





"Dow Passes 23,000 for the First Time, Fueled by Strong Earnings"

#Dow23K 45.wh.gov/Dow23K



9:16 AM - 17 Oct 2017

Dow 24,000



Follow

The Dow just broke 24,000 for the first time (another all-time Record). If the Dems had won the Presidential Election, the Market would be down 50% from these levels and Consumer Confidence, which is also at an all-time high, would be "low and glum!"

7:46 AM - 30 Nov 2017

19,498 Retweets 92,176 Likes







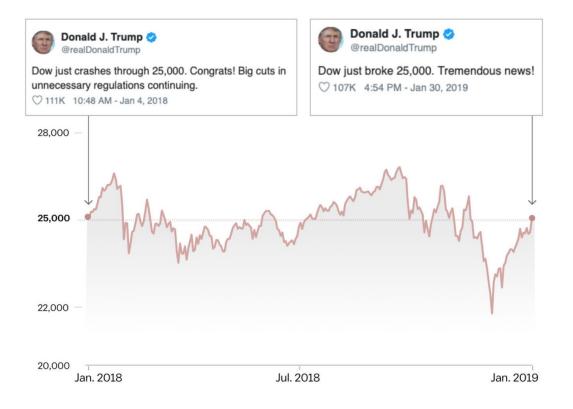








Dow 25,000...x2





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BUSINESS NEWS NOVEMBER 25, 2020 / 12:38 AM / UPDATED A YEAR AGO

Dow Jones hits 30,000 as Wall Street bets on 2021 bounce

By Reuters Staff

2 MIN READ







Milestone and TV Coverage of Stock Market

