# Flow and Stock Effects of Large-Scale Treasury Purchases 

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## Overview

- Fed announced plan to buy up to $\$ 300$ billion of longer-term Treasuries on March 18, 2009.
- Intent was to decrease long-term interest rates.
- From a theoretical perspective, it is not obvious this should work.
- Perfect arbitrage models suggest that supply/demand factors do not affect financial asset prices.
- Our question: Did it work?


## Overview

- Why does this matter?
- Immediate policy relevance
- Broader academic importance - test of 'preferred habitat' models
- Previous work on effects of supply fluctuations is somewhat inconclusive.
- Innovations of our approach:
- Security-level panel data
- Controls for purchases of "substitutes"
- Sample splits by security characteristics
- Stock and flow effects


## Plan of the talk

- Previous theory and evidence
- Preferred habitat / portfolio balance / imperfect asset substitution theories generate a role for supply in pricing
- Previous work is consistent with this idea, but it is hard to say for sure because of the aggregate nature of the data
- Overview of the LSAP program and our data
- Estimates of Stock Effects
- Explain cross-section of returns during the program
- Results:
- Purchases shifted the yield curve persistently down by 20 to 50 bp.
- Effects were more segmented for less liquid securities
- Estimates of Flow Effects
- Explain change in prices on days when purchases occurred (panel)
- Results:
- Purchase operations on average shifted yields in the purchased sector down by 3.5 bp.
- Effects were more segmented and more persistent for less liquid securities


## Theoretical motivation

- In standard arbitrage-free models with risk-neutral traders and exogenous short-term rate there is no role for Treasury supply.
- In order for changes in bond supply to affect pricing, a friction must exist that limits arbitrage across different types of assets: imperfect substitutability.
- Models with preferred-habitat investors and riskaverse arbitrageurs formalize this view. GreenwoodVayanos(2008) and Vayanos-Vila (2009).


## Preferred-habitat view generates 4 hypotheses that we test:

- H1. Changes in Treasury supply have significant effects on Treasury yields
- H2. Those effects are larger for purchased securities, somewhat smaller for similar maturities, and minimal for distant maturities
- H3. These differences in responses are more pronounced in segmented portions of the market
- H4. For securities in those portions, even anticipated purchases might have effects when they actually occur, resulting in persistent price changes


## Previous Evidence

- Bernanke et al. (2004) studied responses of yield curve during several episodes of government interventions.
- Taharan(1995), and Kuttner (2006) test responses of yields to Fed interventions
- Greenwood and Vayanos (2008), Krishnamurthy and VissingJorgenson (2007), Hamilton and Wu (2010) look at aggregate measures of supply
- Time-series and event studies of the LSAP programs - Gagnon et al. (2010) and others.
- All aggregate-level studies suggest negative effects of supply on yields, but substantial variance across magnitudes and statistical significance of estimates
- Aggregate data complicate identification and limit what can be learned about differences in impact across term structure


## Review of Treasury LSAP

- Program announced March 18, 2009.
- Extension through October and tapering announced on August 12.
- $\$ 300$ billion purchased, $95 \%$ in nominal securities.
- 60 operations in bi-weekly cycles from March 25 - October 29.
- Maturity ranges pre-announced.
- Excluded securities announced the morning of the operation.
- Offers accepted through ~11 AM.
- Purchases settled the following day.

Table 1. Characteristics of Nominal Treasury LSAP Purchases

|  | Average of LSAP <br> purchases | Average of all outstanding coupon <br> securities |
| :--- | :---: | :---: |
| Remaining maturity | 6.5 years | 5.7 years |
| Coupon | $3.7 \%$ | $3.8 \%$ |
| Yield | $2.4 \%$ | $1.9 \%$ |
| Time since issued | 4.0 years | 3.9 years |
| \% On-the-run | $29.0 \%$ | $4.9 \%$ |
| \% Notes | $79.5 \%$ | $82.8 \%$ |

Note: All figures are dollar-weighted.
Table 2. Indicators of Liquidity in the Nominal Treasury Market

|  | Daily <br> market <br> volume | $10-$-year <br> on-the-run <br> premium | Fails to <br> deliver | Average absolute <br> fitting errors of <br> Svensson curve |
| :--- | :---: | :---: | :---: | :---: |
| March 25-July 6 2009 | $\$ 100$ bil | 38 bp | $\$ 73$ bil | 6.4 bp |
| July 7-October 29 2009 | $\$ 120$ bil | 28 bp | $\$ 15$ bil | 3.3 bp |

Notes: Volume data come from Bloomberg, and fails-to-deliver data come from the FR 2004 reports. The on-the-run premium is the difference between the yield on the on-the-run 10-year note and 10-year value from a Svensson curve fit to off-the-run securities.

## Nominal Treasury coupon yields: 17 March 2009



## Selected Treasury Yields during Treasury LSAP Program



## Data

- Daily percentage price changes on 204 Treasury coupon securities( including 44 never purchased).
- Exclude:
- TIPS
- Remaining maturities < 90 days
- For each LSAP operation:
- CUSIPS eligible for purchase
- Amount of each CUSIP actually purchased
- Amounts of each CUSIP outstanding, vintage, coupon, maturity, fitting error, accrued coupon payments, $\%$ held by SOMA.


## Why CUSIP-level data?

- To capture differences in returns between securities that were purchased in different amounts, identifying impact of purchases.
- To parse price reactions more finely (for example, examine differential effects of purchases across securities characteristics).
- To estimate substitution effects across securities by constructing for each CUSIP buckets of Treasuries with similar maturities.


## Stock effects

- The fact that yields generally moved up does not mean that the program was ineffective.
- Yields might have been even higher without LSAPs.
- Hard to get at this with time-series information alone.
- Our identification comes from cross-sectional variation in yields.
- Did yields rise less for securities we purchased more of?


## Stock effects

- Some issues:
- Our use of total cumulative changes avoids having to deal with expectations and timing issues.
- Includes effects of March 18 announcement
- But, it leads to a possible endogeneity problem:
- What if we were more likely to purchase those securities whose yields rose most?
- To deal with this, we use IV, where our instruments are pre-determined.


## Substitutes

- We might also think that a security's yield is affected by purchases of other, similar securities.
- Thus, for each security $i$, we define buckets of substitutes, based on maturity:
- Near substitutes: within 2 years of $i$
- For the flow effects
- Mid-substitutes: 2-6 years from $i$
- Far substitutes: 6-14 years from i
- We also instrument these variables.
- Same instruments, plus average each instrumental variables over the bucket of substitute.


## Stock effects

- IV cross section of returns from March 17 October 30, 2009.
- Our basic setup is

- allow for the coefficients to depend on the security characteristics - old and new bonds and notes


## Coefficient interpretation

- $\beta$ reflects the own-price elasticity
- Its magnitude is mainly indicative of purchase effects on yield-curve fitting error
- $\gamma$ reflects cross-elasticity of Treasury prices with respect to other Treasury securities
- Its magnitude affects aggregate level and term structure of yields


## Dependent Variable: Actual LSAP Purchases

 Independent Variables: Security Characteristics as of March 17| Intercept | $0.051^{* * *}$ |
| :--- | :---: |
|  | $(0.015)$ |
| Remaining maturity | $0.015^{* * *}$ |
| Remaining maturity squared | $(0.003)$ |
|  | $-0.0006^{* * *}$ |
| Svensson fitting error | $(0.00009)$ |
|  | $0.208^{* * *}$ |
| \% of issue held by Fed | $(0.038)$ |
|  | $-0.271^{* * *}$ |
| On-the-run dummy | $(0.083)$ |
|  | $0.091^{* * *}$ |
| < 2-years dummy | $(0.024)$ |
|  | $-0.044^{* * *}$ |
| \# Obs | $(0.014)$ |
| Adjusted R2 | 148 |

## Stock Effects—IV Second-Stage Pooled

|  | Gross returns | Adjusted returns |
| :--- | :---: | :---: |
| Own Purchases (IV) | $2.17^{* * *}$ | $1.15^{* * *}$ |
|  | $(0.43)$ | $(0.25)$ |
| Purchases of near substitutes (IV) | $0.13^{* *}$ | $0.09^{* *}$ |
| (maturity w/in 2 yrs of own) | $(0.07)$ | $(0.04)$ |
|  |  |  |
| Remaining maturity | $-0.003^{* *}$ | -0.0004 |
|  | $(0.001)$ | $(0.0006)$ |
| Remaining maturity squared | 0.00003 | $-0.00004^{*}$ |
|  | $(0.00004)$ | $(0.00002)$ |
| Intercept | $0.011^{* * *}$ | $0.009^{* * *}$ |
|  | $(0.002)$ | $(0.0012)$ |
| \# Obs | 148 | 148 |
| Adj. R |  | 0.695 |

## Stock Effects (IV)—Subsamples

|  | Notes <br> Far off-therun | Bonds $<15$ years | Notes <br> Near-on therun | Bonds <br> > 15 years |
| :---: | :---: | :---: | :---: | :---: |
| Own Purchases (IV) | $\begin{gathered} 1.39 \\ (0.93) \end{gathered}$ | $\begin{gathered} 1.13^{* * *} \\ (0.37) \end{gathered}$ | $\begin{gathered} 0.32 \\ (0.53) \end{gathered}$ | $\begin{gathered} 0.22 \\ (0.34) \end{gathered}$ |
| Purchases of near substitutes <br> (IV) <br> (maturity w/in 2 yrs of own) | $\begin{aligned} & 0.07^{*} \\ & (0.04) \end{aligned}$ | $\begin{gathered} 0.14^{* * *} \\ (0.05) \end{gathered}$ | $\begin{aligned} & 0.08^{*} \\ & (0.05) \end{aligned}$ | $\begin{gathered} 0.19 * * \\ (0.08) \end{gathered}$ |
| Remaining maturity | $\begin{gathered} -0.0009 \\ (0.0007) \end{gathered}$ |  |  |  |
| Remaining maturity squared | $\begin{aligned} & -0.00002 \\ & (0.00003) \end{aligned}$ |  |  |  |
| Intercept | $\begin{gathered} 0.010^{* * *} \\ (0.001) \end{gathered}$ |  |  |  |
| \# Obs | 148 |  |  |  |
| Adj. $\mathbf{R}^{2}$ | 0.893 |  |  |  |

## Counterfactual yields

- We use these results to estimate cumulative effects of LSAPs on aggregate yield curve.
- For each security, using actual value of own purchases and its near substitutes, together with coefficients of appropriate subsamples, compute estimated total price change due to LSAP.
- Subtract this value from actual end-of period price to get counterfactual price of each security.
- Prices are then smoothed using Svensson curve to obtain counterfactual end-of-period yields


## Stock effect of LSAP on nominal yield curve



## FLOW EFFECTS

- Response of prices to ongoing purchases operations.
- Purchase operations are announced in advanced, list of CUSIPs and sizes of operations are predictable, so no significant response at aggregate level.
- The particular CUSIPs that are purchased and the distribution of amount purchased should matter, causing portfolio rebalancing activity.
- On top of portfolio rebalancing, significant response should reflect liquidity and microstructure issues.


## Flow effects

- Panel framework: CUSIP level data on operation days.
- Our basic setup is



## Notes

- The time dummies control for lots of things in a limited portion of the curve(maturity sector)
- Macro data, Treasury issuance
- The fixed effects control for lots of things.
- Vintage, maturity, coupon rate
- Market participants don't know in advance total amount to be purchased and distribution of purchased across CUSIPs.


## Timing and Sample

- Eligible vs. non-eligible
- Notes vs. Bonds
- Near on-the-run vs. Far off-the-run
- First half vs. second half of the program
- Day of purchase vs. day after


## Flow Effects on Day of Purchase—Eligible Securities <15y

|  | $\begin{gathered} \text { Mar } 25-\mathrm{Jul} \\ 6 \end{gathered}$ | $\begin{array}{\|c} \text { Jul } 7 \text { - Oct. } \\ 29 \end{array}$ | Notes | Bonds | Near on-therun | Far off-therun |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Own Purchases | $\begin{gathered} 0.3442 * * * \\ (0.094) \end{gathered}$ | $\begin{gathered} 0.2975 * * * \\ (0.089) \end{gathered}$ | $\begin{gathered} \hline 0.2669^{* * *} \\ (0.068) \end{gathered}$ | $\begin{gathered} \hline 0.2498^{* * *} \\ (0.090) \end{gathered}$ | $\begin{gathered} \hline 0.2318^{* *} \\ (0.107) \end{gathered}$ | $\begin{gathered} \hline 0.2488^{* * *} \\ (0.065) \end{gathered}$ |
| Purchases of: |  |  |  |  |  |  |
| Near substitutes (maturity w/in 2 yrs of own) | $\begin{gathered} 0.2863 * * * \\ (0.086) \end{gathered}$ | $\begin{gathered} 0.3038 * * * \\ (0.083) \end{gathered}$ | $\begin{gathered} 0.2503^{* * *} \\ (0.062) \end{gathered}$ | $\begin{gathered} 0.1694^{* *} \\ (0.083) \end{gathered}$ | $\begin{gathered} 0.2435^{* *} \\ (0.105) \end{gathered}$ | $\begin{gathered} 0.1584^{* * *} \\ (0.057) \end{gathered}$ |
| Mid-substitutes (maturity 2 to 6 years away) | $\begin{gathered} 0.1989 * * * \\ (0.082) \end{gathered}$ | $\begin{gathered} 0.2037 * * \\ (0.073) \end{gathered}$ | $\begin{gathered} 0.2088^{* *} \\ (0.055) \end{gathered}$ | $\begin{aligned} & 0.0929 \\ & (0.080) \end{aligned}$ | $\begin{gathered} 0.2501^{* * *} \\ (0.092) \end{gathered}$ | $\begin{aligned} & 0.0744 \\ & (0.055) \end{aligned}$ |
| \# Obs. | 563 | 360 | 769 | 154 | 249 | 674 |
| \# CUSIPS | 131 | 121 | 123 | 23 | 53 | 114 |
| Adj. R ${ }^{2}$ | 0.974 | 0.975 | 0.976 | 0.986 | 0.986 | 0.977 |

## Flow Effects on Day of Purchase-All Securities

|  | Eligible |  | Ineligible |  |
| :---: | :---: | :---: | :---: | :---: |
|  | $<15 y$ to maturity | $>15 y$ to maturity | $<15 y$ to maturity | $>15 y$ to maturity |
| Own Response ( $\beta$ ) | $\begin{gathered} 0.2763^{* * *} \\ (0.053) \end{gathered}$ | $\begin{aligned} & -0.1063 \\ & (0.098) \end{aligned}$ | --- | --- |
| Cross Responses ( $\gamma_{j}$ ): |  |  |  |  |
| Near substitutes (within 2 years) | $\begin{gathered} 0.2403^{* * *} \\ (0.048) \end{gathered}$ | $\begin{gathered} -0.1238 * * * \\ (0.044) \end{gathered}$ | $\begin{gathered} 0.0665^{* * *} \\ (0.018) \end{gathered}$ | $\begin{aligned} & -0.0268 \\ & (0.053) \end{aligned}$ |
| Mid-substitutes (2 to 6 years away) | $\begin{gathered} 0.1700^{* * *} \\ (0.045) \end{gathered}$ | $\begin{gathered} 0.0501 * \\ (0.026) \end{gathered}$ | $\begin{gathered} 0.0047 \\ (0.0099) \end{gathered}$ | $\begin{aligned} & -0.007 \\ & (0.021) \end{aligned}$ |
| Far substitutes (6 to 14 years away) | --- | --- | $\begin{gathered} -0.0238^{* *} \\ (0.008) \end{gathered}$ | $\begin{aligned} & 0.0021 \\ & (0.003) \end{aligned}$ |
| \# Obs. | 923 | 145 | 8008 | 1104 |
| \# CUSIPS | 146 | 23 | 181 | 23 |
| Adj. R ${ }^{2}$ | 0.976 | 0.985 | 0.52 | 0.96 |

Flow Effects on Day of Purchase, by Sub-Period

|  | Eligible |  | Ineligible |  |
| :--- | :---: | :---: | :---: | :---: |
|  | Mar 25 - <br> Jul 6 | Jul 7- <br> Oct. 29 | Mar 25 - <br> Jul 6 | Jul 7 - <br> Oct. 29 |
| Own Response ( $\beta$ ) | $0.3442^{* * * *}$ <br> $(0.094)$ | $0.2975^{* * *}$ <br> $(0.089)$ | --- | --- |
| Cross Responses ( $\gamma_{j}$ ): |  |  |  |  |
| Near substitutes <br> (within 2 years) | $0.2863^{* * * *}$ <br> $(0.086)$ | $0.3038^{* * *}$ <br> $(0.083)$ | $-0.127^{* * *}$ <br> $(0.025)$ | $0.3844^{* * *}$ <br> $(0.031)$ |
| Mid-substitutes <br> (2 to 6 years away) | $0.1989^{* * * *}$ <br> $(0.082)$ | $0.2037 * *$ <br> $(0.073)$ | $-0.143^{* * *}$ <br> $(0.015)$ | $0.2021^{* * *}$ <br> $(0.017)$ |
| Far substitutes <br> (6 to 14 years away) | --- | --- | $-0.153^{* * *}$ <br> $(0.014)$ | $0.0925^{* * *}$ <br> $(0.011)$ |
| \# Obs. | 563 | 360 | 4529 | 3479 |
| \# CUSIPS | 131 | 121 | 167 | 172 |
| Adj. R ${ }^{2}$ | 0.974 | 0.975 | 0.51 | 0.57 |


| Day after, Notes | Eligible |  | Ineligible |  |
| :---: | :---: | :---: | :---: | :---: |
|  | Mar 25- Jul 6 | Jul 7 - Oct. 29 | Mar 25 - Jul 6 | Jul 7 - Oct. 29 |
|  |  |  |  |  |
| Own Response ( $\beta$ ) | $-0.379^{* * *}$ <br> $(0.143)$ | -0.145 <br> $(0.116)$ | --- | --- |
| Near substitutes <br> (within 2 years) | $-0.478^{* * *}$ <br> $(0.145)$ | -0.152 <br> $(0.108)$ | $-0.464^{* * *}$ <br> $(0.039)$ | $-0.135^{* * *}$ <br> $(0.049)$ |
| Mid-substitutes <br> (2 to 6 years away) | $-0.620^{* * *}$ <br> $(0.139)$ | -0.106 <br> $(0.087)$ | $-0.436^{* * *}$ <br> $(0.035)$ | -0.009 <br> $(0.039)$ |
| Far substitutes <br> (6 to 14 years away) | --- | --- | $-0.308^{* * *}$ | $0.134^{* * *}$ |
| \# Obs. | 442 | 327 | $(0.039)$ | $(0.038)$ |
| \# CUSIPS | 108 | 111 | 3891 | 2960 |
| Adj. R 2 | 0.986 | 0.974 | 144 | 0.573 |


| Day after, Bonds | Eligible |  | Ineligible |  |
| :---: | :---: | :---: | :---: | :---: |
|  | $0.377^{* * *}$ <br> $(0.145)$ | $0.58^{* * *}$ <br> $(0.117)$ | --- | --- |
| Near substitutes <br> (within 2 years) | 0.157 <br> $(0.098)$ | $0.556^{* * *}$ <br> $(0.119)$ | -0.047 <br> $(0.046)$ | $0.086^{*}$ <br> $(0.047)$ |
| Mid-substitutes <br> (2 to 6 years away) | 0.111 <br> $(0.082)$ | $0.472^{* * *}$ <br> $(0.125)$ | $-0.057^{* * *}$ <br> $(0.018)$ | $-0.046^{* * *}$ <br> $(0.020)$ |
| Far substitutes <br> (6 to 14 years away) | --- | --- | $-0.049^{* * *}$ | $0.015^{* * *}$ <br> $(0.014)$ |
| \# Obs. | 121 | 33 | 638 | 519 |
| \# CUSIPS | 23 | 10 | 23 | 23 |
| Adj. R 2 | 0.99 | 0.99 | 0.94 | 0.93 |

## Robustness

- Same exercise using yields: similar conclusion
- Clustered errors by maturity: similar conclusions
- Estimation of balanced panel by FGLS: very similar results
- Role for expectations: actual purchase distribution vs expected purchase distribution. The cross section responses are not affected by the surprise effect.


## Conclusions

We estimate that:

- average purchase operation temporarily reduced yields by about 3.5 basis points.
- The program as a whole shifted the yield curve down by 23 basis points on average.
- Effects are larger in less-liquid segments of the market.


## A motivating exercise:

## Explaining the cross-section of yield changes on March 18

| Dependent variable: Percentage price changes on 3/18, by CUSIP |  |
| :--- | :---: |
| Intercept | $-0.008^{* * *}$ |
|  | $(0.0007)$ |
| Fitting error | $0.013^{* * *}$ |
|  | $(0.003)$ |
| Fitting error squared | $0.068^{* * *}$ |
|  | $(0.012)$ |
| Remaining maturity | $0.006^{* * *}$ |
|  | $(0.0001)$ |
| Remaining maturity squared | $-0.0002^{* * *}$ |
|  | $(0.0000)$ |
| On-the-run dummy | -0.0009 |
|  | $(0.0013)$ |
| Vintage | $0.00009^{* *}$ |
|  | $(0.00002)$ |
| Adj. $R^{2}$ | 0.97 |

## Nominal Treasury coupon yields: 30 October 2009



