# Savings and consumption responses to persistent income shocks 

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## Introduction

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## - Today:

1 Data: micro data on bank accounts and mortgage from Ireland
a Identify unexpected persistent shock to mortgage payments (=income shock)
b Estimate response of bank balances to shock
b Use budget constraint to back out consumption response to shock
d Explore heterogeneity by balances in bank account and shock length
2 Model: Can standard consumption-savings explain the estimated responses?

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d Explore heterogeneity by balances in bank account and shock length
2 Model: Can standard consumption-savings explain the estimated responses?

- Main findings:

1 Average MPC $\partial c_{t} / \partial \tau_{t}$ is high: 0.91
2 By bank balance: 1.006 for lowest and 0.82 for highest balance quartiles
3 By shock length: 0.84 for 6-10 year shock; 0.63 for $\leq 5$ year shock
4 Model matches average MPC with 62 quarter shock

## Literature: MPCs

- Covariance restrictions. Hall \& Mishkin (1982), Blundell, Pistaferri \& Preston (2008)
- Subjective expectations. Hayashi (1985), Pistaferri (2001)
- Quasi-experimental.

Expected one-time shock. Shapiro \& Slemrod (1995, 2003, 2009), Souleles (1999, 2002), Hsieh (2003), Johnson, Parker \& Souleles (2006), Kueng (2018), Baugh, Ben-David, Park \& Parker (2021), Lewis, Melcangi \& Pilossoph (2021)
Unexpected one-time shock. Bodkin (1959), Agarwal \& Qian (2014), Fagereng, Holm \& Natvik (2020)
Expected persistent shock. Bernheim, Skinner \& Weinburg (2001), Aguiar \& Hurst $(2005,2007)$
Unexpected persistent shock. Di Maggio, Kermani, Keys, Piskorski, Ramcharan, Seru, \& Yao (2017),
Baker (2018), Ganong \& Noel (2019)

- Model comparison. Kaplan \& Violante (2014)
- Identification strategy. Byrne, Kelly \& O'Toole (2021)
- Irish household finance. Cussen, Lydon \& O'Sullivan, (2018), Horan, Lydon \& McIndoe-Calder (2020), Le Blanc, Lydon (2022)


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- Our contribution

1 Estimate MPC using a quasi-experimental persistent income shock
2 Heterogeneity by initial bank balance and by length of the shock
3 Evaluate performance of standard consumption-savings model with persistent shocks

## Message from the today

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- Comparison to literature:
- Higher MPC than literature (di Maggio et. al., MPC for cars=0.4; Baker elasticity = 0.33)
- Literature: Data MPC (0.5) >> Model MPC (0.05) for transitory shocks (Fagereng Holm \& Natvik)
- This paper: Data MPC $\approx$ Model MPC for persistent shocks
$\rightarrow$ Standard model performs comparatively well for persistent shocks


## 1. Data and consumption response

 2. Model of consumption-savings
## Payment shock: variable and tracker mortgage interest rates

(a) Share of new mortgages issued by interest rate


- Overlap in variable/tracker samples •distributions


## Payment shock: variable and tracker mortgage interest rates

(b) Divergence in ECB Tracker and Standard Variable
(a) Share of new mortgages issued by interest rate


- Overlap in variable/tracker samples *distributions


## Data: mortgage and bank account data in Ireland

1 Mortgage data

- At origination: age, income, county, house price, mortgage size, interest rate
- Over time: outstanding balance, interest rate, days past due
- Six monthly, 2000-2016 for origination data; 2012-2016 for over time
- Estimate: current LTV w/ post code price index

2 Bank account data

- Average balance over quarter (quarterly), balance at end date (6 monthly).
- Checking and savings accounts
- Quarterly, Q3 2011 - Q4 2014
- Do not see accounts in multiple banks, or non-bank savings


## 3 Cleaning

- Household view: Link all mortgages, bank accounts for household
- Restrict to active (non-constant/zero) checking accounts (when using savings data)
- Mortgages originated 2000-2008
- Quarterly panel: Q3 2011 - Q4 2014
- $N \approx 10,000$ households $\times 14$ quarters $\approx 140,000$


## Household finances in Ireland

How much of household savings are captured in our data:
1 How much of non-housing assets are in deposit savings

- Macro data: 91\% Quarterly Financial Accounts
- Micro data: $55 \%$ HFCS, evidence of large ( $\approx 66 \%$ ) under reporting of deposits (Cussen, Lydon \& O'Sullivan, 2018)


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2 How much of deposit savings are in bank accounts

- Bank deposits: 66\%
- Non-bank deposits (e.g. credit unions, Post Office): 34\%


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- Non-bank deposits (e.g. credit unions, Post Office): 34\%

3 How much of bank deposits are in a single bank

- Bank accounts per household in Ireland: 5.2
- Bank accounts per household in our data: 4
- We can check results for households with both checking and savings accounts
- Checking account MPC $=0.93$; Savings account MPC $=0.95$
$\rightarrow$ Results are similar


## Size of payment savings

Payment savings:

$$
\begin{array}{rlcr}
m_{t}^{\text {flow }} & =\text { pay }_{t}^{\text {variable }}-\text { pay }_{t}^{\text {tracker }}>0 & & \text { if tracker } \\
& = & 0 & \\
m_{t}^{\text {stock }} & = & \sum_{j=0}^{t} m_{j}^{\text {flow }} &
\end{array}
$$

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\end{array}
$$




Median: $5 \%$ of income; 20\% of payments

## Comparing variable and tracker mortgage borrowers (ex-ante)


(a) Income at origination

(b) Age at origination

(c) Mortgage balance at origination

## Comparing variable and tracker mortgage borrowers (ex-post)

Q. Were trackers more likely to get income shocks?

- Use survey of mortgage holders 2012Q2 - 2013Q1 (Byrne, Kelly, O’Toole, 2021)

|  | Income Change |  |  |  | Unemployed |  |  |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | $(1)$ | $(2)$ | $(3)$ |  | $(4)$ |  | $(5)$ |
| Tracker | $-0.254^{* * *}$ | -0.129 | 0.029 |  | -0.029 | 0.001 | 0.005 |
|  | $(0.0683)$ | $(0.0774)$ | $(0.0611)$ |  | $(0.0215)$ | $(0.0244)$ | $(0.0256)$ |
| Observations | 616 | 616 | 593 |  | 626 | 626 | 593 |
| Adjusted $R^{2}$ | 0.020 | 0.044 | 0.464 |  | 0.001 | 0.026 | 0.006 |
| Origin year and bank FE |  | Yes | Yes |  |  | Yes | Yes |
| Controls |  |  | Yes |  |  | Yes |  |

## Regression: savings response

$$
\Delta b_{i, t+k}=\beta_{0}+\beta_{k} \Delta m_{i, t+k}^{s t o c k}+\eta \mathbf{X}_{i t}+\gamma_{t+k}+u_{i, t+k} \quad \text { for } \mathrm{k}=1, \ldots, 12
$$

- $\Delta b_{i, t+k}$ is the change in bank balance of household $i$ between quarter $t$ and $t+k$
- $\Delta m_{i, t+k}^{\text {stock }}$ is change in stock payment savings between $t$ and $t+k$
- $\Delta m_{i, t+k}^{\text {stock }}>0$ if tracker mortgage
- $\Delta m_{i, t+k}^{\text {stock }}=0$ if variable mortgage
- $X_{i t}$ is a vector of observable controls
- $\gamma_{t+k}$ are time fixed effects
- Variations:
- logs and levels
- pooled and different time horizons


## Result: Savings response at many horizons



- 12 quarter estimate
- $M P S_{t+12}=0.074 ;$
- Implied MPC= 0.93
- $M P S_{t+h}=\sum_{s=0}^{h}(1+r)^{h-s}(1-M P C)$
- Average pooled estimate
- MPS = 0.087;
- Implied MPC = 0.913


## MPC heterogeneity

1 Average MPC=0.913 (MPS=0.087). . table
2 Split samples
a Savings balances at 2011Q3: > table

- Lowest balance quartile: 1.006
- Highest balance quartile: 0.82
b Mortage maturity at 2010Q1: • table
- $<=5$ year to maturity: 0.46 (imprecise)
- 6-10 year to maturity: 0.84
- >10 year to maturity: 0.93


## 1.Data \& consumption response

2. Model of consumption-savings

## Consumption-savings problem by households

Households solve infinite horizon problem

$$
\begin{aligned}
\max _{c, a} & \sum_{t=0}^{\infty} \mathbf{E}_{0}\left[\beta^{t} \frac{c_{t}^{1-\sigma}}{1-\sigma}\right] \\
c_{t}+a_{t} & =(1+r) a_{t-1}+e_{t}+\tau_{t} \\
a & \geq 0 \\
\ln e_{t} & =\rho_{e} \ln e_{t-1}+\epsilon_{t} \quad \epsilon_{t} \sim \mathcal{N}\left(0, \sigma_{e}^{2}\right)
\end{aligned}
$$

Perfect foresight for path $\left\{\tau_{s}\right\}_{s \geq 0}$.
Compare to stationary distribution with $\tau_{s s}=0$

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Compare to stationary distribution with $\tau_{s s}=0$
Policies $c_{t}^{*}\left(e_{t}, a_{t-1} ; \boldsymbol{\tau}\right)$ and $a_{t}^{*}\left(e_{t}, a_{t-1} ; \boldsymbol{\tau}\right)$
Distribution's law of motion $D_{t+1}\left(e_{t+1}, a_{t}\right)=\sum_{e_{t}} D_{t}\left(e_{t}, a_{t}^{*-1}\left(e_{t}, a_{t} ; \tau\right)\right) \mathcal{P}\left(e_{t}, e_{t+1}\right)$

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Calibration: $\sigma=2, r=0.01, \beta=0.98, \rho_{e}=0.966, \sigma_{e}=0.5$ (Auclert, et. al.) $\tau=0.04, \tau / e=[0.15,0.1,0.07,0.05,0.03,0.02,0.01]$ interquartile range $\approx 3-7 \%$ income

[^0]
## Computing MPCs

Individual MPCs

$$
M P C_{t}\left(e_{t}, a_{t-1} ; \tau\right)=\left[c_{t}^{*}\left(e_{t}, a_{t-1} ; \tau\right)-c_{s s}^{*}\left(e_{t}, a_{t-1}, 0\right)\right] / \tau
$$

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$$

Average $C_{t}(\boldsymbol{\tau})=\sum_{e} \int_{a} c_{t}^{*}\left(e_{t}, a_{t-1} ; \tau\right) D_{t}\left(e_{t}, a_{t-1}\right)$

Average MPC

$$
M P C_{t}(\boldsymbol{\tau})=\left[C_{t}(\boldsymbol{\tau})-C_{s s}(0)\right] / \tau
$$

## The model experiment



## Comparing model and data



- MPC errors (data-model) $=[-0.004,-0.021,0.084,0.071]$
- Close quantitatively relative to 1 time shock


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## Comparing length of the shock



- Smaller MPC for less persistent shocks in both model and data
- Data > model errors increase with less persistent shocks


## Conclusions

- Compared savings responses in model and data with persistent shocks

1 Data: Average MPC is high 0.92

- By bank balance: Lower MPC (0.82) for high bank balance consumers
- By shock length: Lower MPC (0.84) for shorter (6-10 year) shocks

2 Model: matches average MPC with 62 quarter shock

- By bank balance: matches covariance, error $\leq 0.08$
- By shock length: matches covariance, error $>0.27$

3 Takeaway:

- Literature: Data MPC >> Model MPC for transitory shocks
- This paper: Data MPC $\approx$ Model MPC for persistent shocks
$\rightarrow$ Standard model performs comparatively well for persistent shocks
- Bonus:
- How do defaults depend on balances? Defauts $\bullet$ Tracker variable


## Thank you

## Bellman

The value function at time $t$ is

$$
\begin{aligned}
& V_{t}\left(e, a_{-}\right)=\max _{c, a}\left\{\frac{c^{1-\sigma}}{1-\sigma}+\beta \sum_{e^{\prime}} V_{t+1}\left(e^{\prime}, a\right) \mathcal{P}\left(e, e^{\prime}\right)\right\} \\
& c+a=(1+r) a_{-}+e+\tau \\
& a \geq 0 \\
& \ln e_{t}=\rho_{e} \ln e_{t-1}+\epsilon_{t} \quad \epsilon_{t} \sim \mathcal{N}\left(0, \sigma_{e}^{2}\right)
\end{aligned}
$$

Perfect foresight for aggregate path $\left\{\tau_{s}\right\}_{s \geq 0}$.
Compare against stationary dist with $\tau_{s s}=0$
Policies $c_{t}^{*}\left(e, a_{-} ; \tau\right)$ and $a_{t}^{*}\left(e, a_{-} ; \boldsymbol{\tau}\right)$
Distribution's law of motion $D_{t+1}\left(e^{\prime}, a\right)=\sum_{e^{\prime}} D_{t}\left(e^{\prime}, a_{t}^{*-1}(e, a ; \tau)\right) \mathcal{P}\left(e, e^{\prime}\right)$

- back


## Warm up: one period shock , shockatuarere 40




- Here: $M P C_{t=0}=\frac{r}{1+r}$ when $\beta=1 / R$
$M P C_{t=0}$ at impact 0.043 with risk and $\beta<1 / R$;
- Kaplan Violante (2014) One-asset: $M P C_{t=0} \approx 0.03$ (non-HtM), $0.15(\mathrm{HtM})$
- Data: $M P C_{t=0} \approx 0.5$ Fagereng, Holm and Natvik (2020)


## Warm up: one period shock

- back





## Asset distribution in steady state

- back




## Other model experiments

- Responses are larger to negative shocks, though not by much for this shock size $>$ link


## Positive versus negative shocks

- back




## Policy functions

- back

Policy function lowest e state


## Average savings responses

- back



## Average consumption responses

## Consumption



## Average responses

- back




## Tracing out the default threshold: LTI-balance space

- back
(a) Default propensity
(b) Defaults



## Distribution of observations

(a) Distribution of observations


## Distribution of variable and tracker mortgage borrowers

- back



## Pooled Marginal Propensity to save (MPS)

- back

$$
\Delta b_{i, t+1}=\beta_{0}+\beta_{1} m_{i t}+\eta X_{i t}+\gamma_{t}+u_{i t}
$$

|  | (1) <br> Savings | (2) <br> Log Savings | (3) <br> $\Delta$ Savings | (4) <br> $\Delta$ Log Savings | (5) <br> Savings | (6) <br> Log Savings | $\Delta$ Savings | $\Delta$ Log Savings |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |

## MPS heterogeneity: by balance quartiles

|  | Savings |  |  |  | Log Savings |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | (1) Lower | (2) <br> Quartile 2 | (3) <br> Quartile 3 | (4) Upper | (5) Lower | (6) <br> Quartile 2 | (7) <br> Quartile 3 | (8) <br> Upper |
| Cumulative Payment Difference | $\begin{gathered} \hline-0.006 \\ (0.0071) \end{gathered}$ | $\begin{gathered} 0.043 \\ (0.0204) \end{gathered}$ | $\begin{gathered} 0.038 \\ (0.0431) \end{gathered}$ | $\begin{gathered} \hline 0.176^{*} \\ (0.0660) \end{gathered}$ |  |  |  |  |
| Log Cumulative Payment Difference |  |  |  |  | $\begin{gathered} 0.039 \\ (0.0441) \end{gathered}$ | $\begin{gathered} 0.123^{*} \\ (0.0525) \end{gathered}$ | $\begin{aligned} & 0.161^{* *} \\ & (0.0510) \end{aligned}$ | $\begin{gathered} 0.083 \\ (0.0428) \end{gathered}$ |
| Observations | 34118 | 32116 | 33936 | 38346 | 34117 | 32115 | 33932 | 38337 |
| Adjusted ( $R^{2}$ ) | 0.516 | 0.403 | 0.469 | 0.854 | 0.813 | 0.537 | 0.571 | 0.769 |
| Individual FE | Yes | Yes | Yes | Yes | Yes | Yes | Yes | Yes |
| Quarter FE | Yes | Yes | Yes | Yes | Yes | Yes | Yes | Yes |
| Controls $\times$ Quarter FE | Yes | Yes | Yes | Yes | Yes | Yes | Yes | Yes |
| $\operatorname{Prob}(\beta=1)$ | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 |

## MPS heterogeneity: by quarters to maturity

- back
- Compute time to maturity when shock starts 2010Q1

|  | $\Delta$ Savings |  |  | $\Delta$ Log Savings |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | (1) $\leq 5 y e a r s$ | $\begin{gathered} \text { (2) } \\ 6-10 y e a r s \end{gathered}$ | (3) <br> $>10$ years | (4) $\leq 5$ years | (5) <br> 6-10 years | (6) <br> $>10$ years |
| D.Cumulative Payment Difference | $\begin{gathered} 0.394 \\ (0.2059) \end{gathered}$ | $\begin{gathered} \hline 0.161^{*} \\ (0.0651) \end{gathered}$ | $\begin{gathered} \hline 0.076^{*} \\ (0.0268) \end{gathered}$ |  |  |  |
| D.Log Cumulative Payment Difference |  |  |  | $\begin{aligned} & 0.130^{* * *} \\ & (0.0206) \end{aligned}$ | $\begin{gathered} 0.022 \\ (0.0332) \end{gathered}$ | $\begin{gathered} 0.031 \\ (0.0313) \end{gathered}$ |
| Observations | 10634 | 23153 | 94835 | 10632 | 23149 | 94826 |
| Adjusted $R^{2}$ | -0.004 | 0.003 | 0.003 | -0.005 | -0.006 | 0.003 |
| Individual FE |  |  |  |  |  |  |
| Quarter FE | Yes | Yes | Yes | Yes | Yes | Yes |
| Controls $\times$ Quarter FE | Yes | Yes | Yes | Yes | Yes | Yes |
| $\operatorname{Prob}(\beta=1)$ | 0.012 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 |

Standard errors in parentheses.

## Size of payment shock

Figure: Box plot of size of payment difference
(a) Euro value

(b) Percent difference (relative to variable payment)


Note: Percent is relative to the first lien only.

## Tracing out the default threshold: LTV-balance space

- Stylized default decision: $V_{t}\left(y, b, \frac{m}{p}\right)=\max \left\{V_{t}^{\text {pay }}\left(y, b, \frac{m}{p}\right), V_{t}^{\text {default }}\left(y, b, \frac{m}{p}\right)\right\}$
(a) Default propensity

| 1.7 | 0.46 | 0.26 | 0.14 | 0.14 | 0 | Default rate |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1.5 | 0.37 | 0.25 | 0.12 | 0.06 | 0.04 |  |
| $\stackrel{m}{\circlearrowleft}_{\stackrel{m}{\leftarrow}}^{1.3}$ | 0.32 | 0.21 | 0.1 | 0.02 | 0.04 |  |
|  | 0.21 | 0.15 | 0.08 | 0.04 | 0.05 | $0.4$ |
| 0.9 | 0.2 | 0.13 | 0.05 | 0.05 | 0.03 | 0.3 |
| $>0.7$ | 0.22 | 0.09 | 0.04 | 0.03 | 0.02 |  |
| 0.5 | 0.16 | 0.09 | 0.05 | 0.02 | 0.03 | 0.0 |
| $0.3-$ | 0.09 | 0.05 | 0.04 | 0.02 | 0.01 |  |
| 0.1 | 0.07 | 0.02 | 0.01 | 0 | 0 |  |
|  | 155 | 547 | 1156 |  | 5374 |  |
| Balance at 2011Q3 (Euro) |  |  |  |  |  |  |

- Many other dimensions of heterogeneity: •Balance-LT-space $\rightarrow$ Distribution $\rightarrow$ Mean balances
- Do not observe income, but can use our "disposable income" shocks >back


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| 1.3 - | 0.32 | 0.21 | 0.1 | 0.02 | 0.04 |  |
| 닫 1.1 | 0.21 | 0.15 | 0.08 | 0.04 | 0.05 |  |
| ก 0.9 - | 0.2 | 0.13 | 0.05 | 0.05 | 0.03 | 0.3 |
| $>0.7$ - | 0.22 | 0.09 | 0.04 | 0.03 | 0.02 | 0.1 |
| $0.5-$ | 0.16 | 0.09 | 0.05 | 0.02 | 0.03 | 0.0 |
| $0.3-$ | 0.09 | 0.05 | 0.04 | 0.02 | 0.01 |  |
| 0.1 - | 0.07 | 0.02 | 0.01 | 0 | 0 |  |
|  | 155 |  |  |  | 5374 |  |
| Balance at 2011Q3 (Euro) |  |  |  |  |  |  |

(b) Defaults

- Many other dimensions of heterogeneity:
- Do not observe income, but can use our "disposable income" shocks >back


## Comparing tracker and variable mortgages

- back



## Tracing out the default threshold: LTV-balance space

- back
- Stylized default decision: $V_{t}\left(y, b, \frac{m}{p}\right)=\max \left\{V_{t}^{\text {pay }}\left(y, b, \frac{m}{p}\right), V_{t}^{\text {default }}\left(y, b, \frac{m}{p}\right)\right\}$
(a) Default propensity

(b) Defaults



## Summary statistics

|  | Mean | P10 | P25 | P50 | P75 | P90 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| No of liens | 1.69 | 1 | 1 | 1 | 2 | 3 |
| No of deposit accounts | 3.97 | 3 | 3 | 3 | 5 | 6 |
| Dublin (\%) | 51 |  |  |  |  |  |
| Borrower Age | 46.32 | 35 | 40 | 46 | 52 | 59 |
| Total Account Balance | 8346 | 42.25 | 565.17 | 2230.16 | 8531.59 | 25823.85 |
| Total Quarterly Average Account Balance | 8060 | 245.53 | 619.77 | 2093.94 | 8315.22 | 24498.02 |
| Current Loan-to-Value | 72 | 7 | 23 | 59 | 109 | 156 |
| Oustanding Balance | 137508 | 16104 | 44148.76 | 109519.28 | 203884.44 | 300785.29 |
| Quarterly Mortgage Payments | 3050.06 | 973.3 | 1637.15 | 2642.15 | 3913.48 | 5656.83 |
| Current Interest Rate (\%) | 4 | 2 | 5 | 5 | 5 | 5 |
| Income at Origination | 69796.72 | 31400 | 44632 | 62500 | 87562.18 | 120146.41 |
| Quarters to Maturity | 56.95 | 13 | 27 | 54 | 85 | 105 |
| Tracker Rate (\%) | 18 |  |  |  |  |  |
| SVR Rate (\%) | 79 |  |  |  |  |  |
| Primary Dwelling Home (\%) | 83 |  |  |  |  |  |

## Comparing across asset quartiles

- Split SS distribution by asset quartiles *distribution


Consumption



[^0]:    - Bellman

