

# Beliefs and Portfolios: Causal Evidence

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November 12, 2021

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# Motivation

- Low interest rate environment and elevated asset valuations
  - How does monetary policy affect asset prices?
  - Are there financial stability risks from asset price bubbles?
  - How do risky assets affect households' wealth?

- Competing asset pricing models give different answers

Campbell and Cochrane (1999); Adam et al. (2017); Myers and De La O (2020)

- Example: Effect of interest rate shock on asset prices Williams (2014)
  - Rational expectations: one-time adjustment of valuations.
  - Extrapolative expectations: belief-driven bubble.

→ **Expectation formation is key!** Brunnermeier et al. (2021)

- Households matter: tight investment mandates and inelasticity

Koijen and Yogo (2019); Gabaix and Koijen (2021)

# This paper

Which mechanism is *causally* shaping households' stock market expectations and *why*?

- Identify causal effects via RCT
- Test leading asset pricing theories jointly

## Main findings:

- Causal evidence for extrapolation of returns *and* earnings  
Greenwood and Shleifer (2014); Myers and De La O (2020); Bordalo et al. (2020); Laudenbach et al. (2021)
- Info preference effect: heterogenous mental models  
Fuster et al. (2019); Andre et al. (2019)
- Beliefs *causally* affect portfolios, resolve puzzle  
Giglio et al. (2021)

# Asset Pricing and Expectations Campbell and Shiller (1988)

$$p_t/d_t = c + \sum_{j=0}^{\infty} \rho^j (\Delta d_{t+1+j} - r_{t+1+j}) \quad (1)$$

- **Data:** Higher P/D followed by lower returns.
- **Rational Expectations:** Higher P/D → *lower* expected returns.

Campbell and Cochrane (1999); Bansal and Yaron (2004); Barro (2006)

- **Extrapolative returns:**  
High past returns (high P/D) → *high* expected returns.

Greenwood and Shleifer (2014); Adam et al. (2017)

- **Extrapolative earnings growth:**  
High past earnings growth → high expected earnings growth.

Myers and De La O (2020); Bordalo et al. (2020)

→ Test predictions in representative survey of 4,000 German households

# Information Treatments

(translated, shortened, re-ordered)

## ■ T1 (Rational Expectations)

*Current price-earnings ratio of DAX is 23. Long-term average is 15.*

- Prior P/E = 10

→ RE prediction: *downward* revision of expected return

## ■ T2 (Extrapolative returns)

*DAX has increased by around 9% over past twelve months.*

- Prior R = 5%

→ Extrapolation: *upward* revision of expected return

## ■ T3 (Extrapolative earnings)

*Earnings of DAX companies decreased by 20% over past twelve months.*

- Prior earnings growth = 4%

→ Extrapolation: *downward* revision

...

## ■ T6 (Placebo)

*Harvest yield of winter rapeseed increased by around 10% in 2019.*

# Econometric Approach (Baseline)

Coibion et al. 2021

$$E[X]_i^{post} = \alpha + \sum_{k=1}^{K-1} \beta_k T_i^k + \sum_{k=1}^{K-1} \gamma_k T_i^k E[X]_i^{pre} + \delta E[X]_i^{pre} + \mathbf{W}_i \phi + \epsilon_i \quad (2)$$

Example ( $\gamma = 0$ ,  $\delta = 1$ ,  $\phi = 0$ ,  $\epsilon_i = 0$ ):

- Revision control group:  $\Delta_c \equiv E[X]_K^{post} - E[X]_K^{pre} = \alpha$
- Revision treatment group:  $\Delta_{t,k} \equiv E[X]_{k=1}^{post} - E[X]_{k=1}^{pre} = \alpha + \beta_k$
- Diff-in-diff:  $\Delta_{t,k} - \Delta_c = \beta_k$

→  $\beta_k$  **measures causal effect of treatment**

→  $\gamma \neq 0$ ,  $\delta \neq 1$  revisions may depend on prior expectations

→  $\phi \neq 0$  control for imperfect randomization

## Treatment Effects (Baseline)

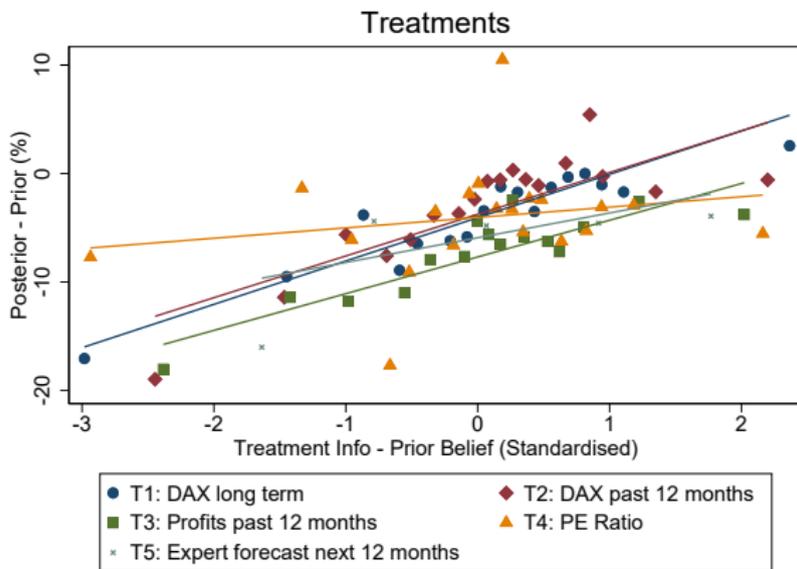
	$E[R_{t+1y}]$
T1 (Rational Expectations)	0.78 (0.48)
T2 (Extrapolative returns)	1.93*** (0.44)
T3 (Extrapolative earnings)	-3.19*** (0.44)
T4 (Expert forecasts)	1.57*** (0.45)
T5 (Long-term average )	0.40 (0.41)
N	3,419

→ *No* response to P/E information

→ Extrapolation of returns and earnings growth

# Learning Rates

- Normalize treatment effects by prior perception gaps



- Exceptionally low learning rate for P/E information
- Incomplete information *and* non-RE information processing

# Measuring the Information Preference Effect

- Real life: individuals choose information
- Do individuals who prefer an information react *more* or *less* to it?
  - less: might have smaller perception gap
  - more: might process the information differently

$$E[X]_i^{post} = \alpha + \sum_{k=1}^{K-1} \left( \beta_k T_i^k + \psi_k P_i^k + \xi_k T_i^k P_i^k \right) + \dots$$

$$\sum_{j=1}^J \left( \sum_{k=1}^{K-1} \gamma_{k,j} T_i^k Z_{i,j} + \delta_j Z_{i,j} \right) + \mathbf{W}_i \phi + \epsilon_i \quad (3)$$

- $\xi_k$  measures the information preference effect

→  $\xi_k =$  Treatment effect if info preferred – treatment effect otherwise

## Information Preference Effect (2nd wave)

	$E[R_{1y}]$	$E[R_{5y}]$	$E[\Delta D_{1y}]$	$E[\Delta D_{5y}]$
T1(RE)*P1	-2.81**	-4.86**	-1.75	-2.58
	(1.32)	(2.07)	(2.09)	(2.23)
T2(Extrap. R)*P2	-0.93	-1.84	0.81	-2.71
	(1.21)	(1.66)	(1.68)	(1.86)
T3(Extrap. Earn.)*P3	-3.36**	-3.87*	-5.22***	-6.17***
	(1.62)	(2.26)	(1.97)	(2.19)
N	3183	3183	3128	3128

Individuals who prefer ...

- ... price-earnings ratio information (T1) respond in line with RE.
- ... earnings information in line with learning about fundamentals.

⇒ **Heterogeneity in mental model of the economy affects information acquisition *and* processing** Dominitz and Manski (2011)

## Risky Portfolio Share Puzzle

- Test Merton (1969):

$$EquityShare_i^{post} = \alpha + \beta \frac{E[\widehat{R}_i^{post}] - R_f}{Var[R_i^{post}]} + \mathbf{X}_i \mathbf{d} + w_i \quad (4)$$

⇒ Prediction:  $\alpha = 0$ ,  $\beta = \frac{1}{\gamma}$  (risk aversion)

- Estimate based on first moments:  $\gamma = 50$  Giglio et al. (2021)
- Estimate based on first *and* second moments:  $\gamma = 909$  (own estimate)

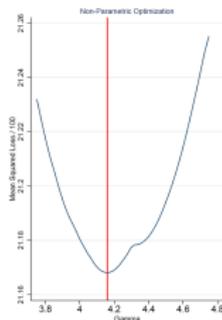
⇒ **Estimated risk aversion,  $\gamma$ , outside plausible range (of 3-10)**

⇒ **Subjective second moments exacerbate puzzle**

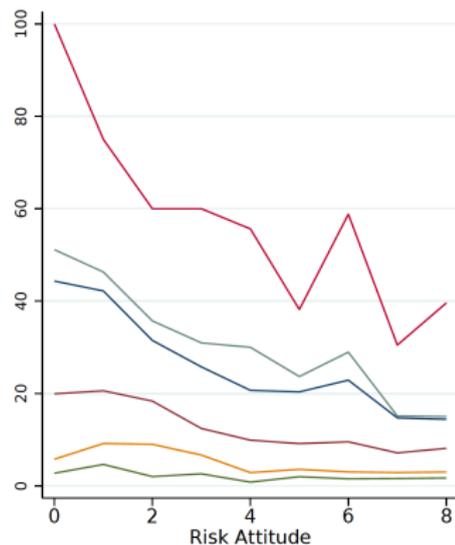
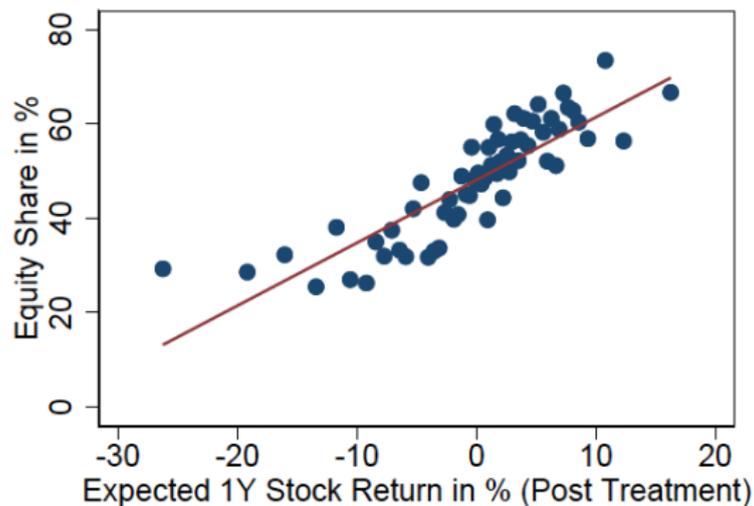
## Solving the Puzzle

- OLS estimate of  $\gamma$  large because:
  - *Optimal* portfolio share: *unbounded*
  - *Actual* portfolio share: *bounded*
- Impose **leverage constraint**:  $EquityShare \leq 100\%$
- Estimate via non-linear least squares (NLLS)
- Result:  $\gamma = 4.2$  !

⇒ **Imposing leverage constraint and using NLLS solves the puzzle!**



# Suggestive Evidence



- Portfolio shares positively correlated with expected returns
- Implied  $\gamma$  smaller for higher willingness-to-take-risks

# Conclusion

- Individuals do **not** understand valuations and returns
- Causal evidence for extrapolation of returns *and* earnings
- Frictions in information acquisition *and* processing
- Heterogeneity matters: mental models
- Conditional on beliefs, households invest rationally
- Information interventions to mitigate bubbles and re-distribution (?)

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