

# Leveraged Funds and the Shadow Cost of Leverage

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June 2020



**WashU Olin  
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# Why do we care?

Measuring the shadow funding cost can educate both asset pricing and financial regulation

- ▶ Financial frictions for intermediaries matter for asset pricing
  - ▶ Theory (Brunnermeier-Pedersen 2009 RFS, He-Krishnamurthy 2013 AER; Brunnermeier-Sannikov, 2014 AER)
  - ▶ Evidence (Adrian-Etula-Muir, 2014 JF; He-Kelly-Manela, 2017 JFE)

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  - ▶ Evidence (Adrian-Etula-Muir, 2014 JF; He-Kelly-Manela, 2017 JFE)
- ▶ Regulatory constraints aim to prevent excessive risk due to government safety net
- ▶ Many opinions and theories
- ▶ Few empirical estimates
  - ▶ Structural estimates for life insurers (Koijen-Yogo, 2015 AER)
  - ▶ Loophole approach for banks (Kisin-Manela, 2016 RFS)
  - ▶ Loophole approach in IR swaps (Fleckenstein-Longstaff, 2018)

## What the paper does?

- ▶ Provides a measure of “shadow cost of leverage constraints”
  - Shadow cost  $\approx$  Return shortfall of leveraged fund
    - Return shortfall of unleveraged fund
- ▶ Imagines a leveraged fund trading with another intermediary that passes along its leverage costs

## Main findings

1. Shadow cost increases by 98 bps per year, upon quarter-ends
2. Shadow cost positively predicts future BAB returns
  - ▶ BAB portfolios are long low- $\beta_{mkt}$  and short high- $\beta_{mkt}$  assets
3. Negative correlation between shadow cost and contemporaneous BAB returns
4. Exposure to time variation in shadow cost negatively predicts stock returns in the cross section

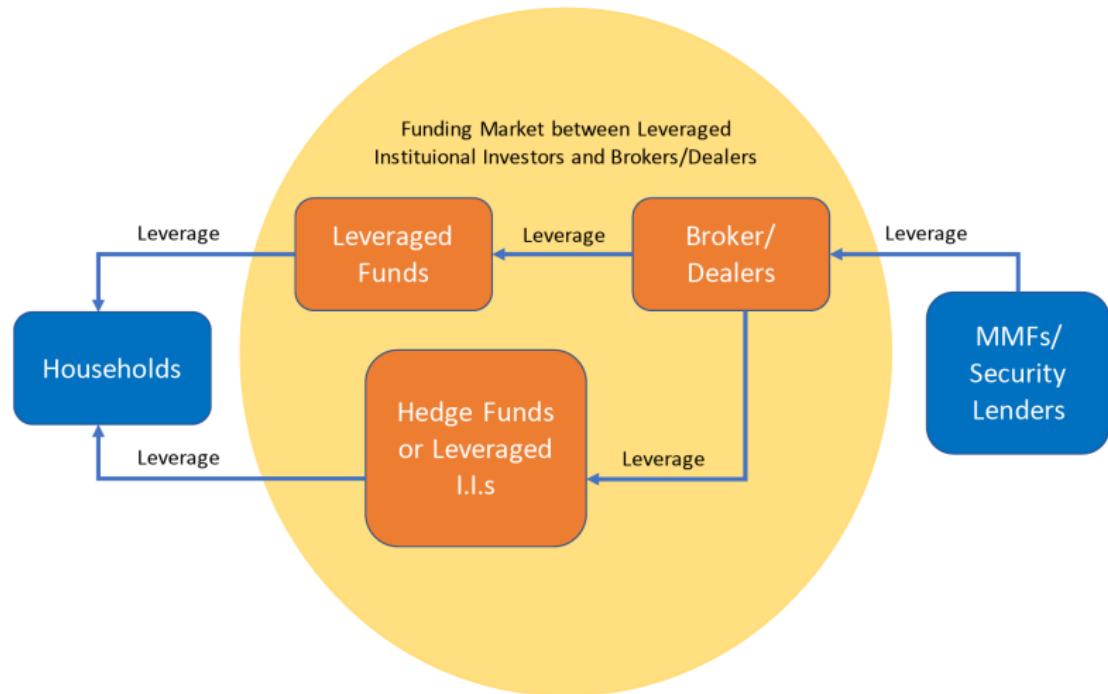
## Contribution

- ▶ Leveraged fund-based shadow cost aligns with theory better than TED spread (Frazzini-Pedersen, 2014)
- ▶ Kojen-Yogo (2016) and Kisim-Manela (2016) quantify the shadow cost of capital for life insurers and banks, respectively
  - ▶ Current measure is more applicable to leveraged equity investors
  - ▶ Time-series and cross-sectional pricing tests of leverage constraints in equities

## Suggestion 1: Explaining prices with fundamentals

- ▶ Claim “price” measure is better than “quantity” measures  
(Adrian-Etula-Muir, 2014; He-Kelly-Manela, 2017; Boguth-Simutin, 2018;  
Asness-Frazzini-Gormsen-Pedersen, 2020)
- ▶ But macro-finance agenda is to move away from explaining  
prices with prices (Cochrane, 2017)
- ▶ Takeaway from 2008 crisis was that intermediaries and  
financial frictions matter a lot
- ▶ What do we learn from your results about the fundamental  
constraints on their leverage?

## Suggestion 2: Whose constraints?



## Suggestion 3: Improve theoretical foundations

- ▶ Theoretical motivation (Garleanu-Pedersen 2011)  
Investor maximizes expected utility of consumption s.t.  
margin constraint

$$\sum_i m_{it} |\theta_{it}| + \eta_{ut} \leq 1$$

then shadow cost *per asset i* is

$$\lambda_t m_{it} = \frac{\mu_{it} - r_{ft}}{\text{Effective risk premium}} - \frac{\beta_{it}}{\text{Consumption risk exposure}} \times \frac{\gamma_t}{\text{Consumption risk premium}}$$

- ▶ To measure the shadow cost using a spread, one needs two assets with same  $\beta_{it}$  and margin requirements  $m_{it}$
- ▶ Big ask!
- ▶ Paper actually measures something else

## Suggestion 3: Improve theoretical foundations

- ▶ Return shortfall:

$$\alpha_{it} = \frac{\delta}{\text{Leverage}} \times \frac{b_{jt}}{\text{Benchmark return}} - \frac{r_{it}}{\text{Leveraged fund return}}$$

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- ▶ Muddies the measure and can be dominated by  $b_{jt} - r_t^{GCrepo}$
- ▶ How about instead:

$$\psi_{it}^* = \frac{\alpha_{it}}{\delta} - \alpha_t^{1x} = r_{it}^{1x} - \frac{r_{it}}{\delta}$$

- ▶ All about funding / operating differences and not the benchmark index

## Suggestion 4: Units

- ▶ Shadow cost is 0.56% per year on average. Is that large?
- ▶ How much would the intermediaries be willing to pay to increase their leverage by X?

## My Take

- ▶ Measuring shadow funding costs can inform both asset pricing and financial regulation
- ▶ Leveraged funds are super interesting institutions worth further study
  - ▶ New sample collected can advance this literature
- ▶ Interesting and intuitive results explaining and predicting BAB returns using leveraged-unleveraged fund spreads
- ▶ Tying up some theoretical loose ends and connecting more to fundamentals

## Other suggestions / minor point

- ▶ Footnote 18: The ICR measure in He, Kelly, and Manela (2017) is the market capital ratio of the holding companies of primary dealers.