# Variation in Liquidity and Costly Arbitrage

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# Variation in Liquidity and Costly Arbitrage

- Model arbitrageur behavior under time-varying liquidity
- Predictions: In stocks with high variation in liquidity
  - Arbitrage activity is lower
  - Mispricing is severe
- Empirical results consistent with the model
- Arbitrage based explanation
  - -ve relationship between variation in liquidity and returns

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### Model

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- 2 assets: 1 risky asset and risk free asset
- 3 Participants: Arbitrageur, Noise Traders, Index funds
- Demand for risky asset
  - X Arbitrageurs
  - Z Noise Traders
  - k Fraction of asset supply S held by index funds

### Modelling Variation in Liquidity

- Stochastic Price Impact
  - Purchase(sale) of X results in price increase (decrease) of  $\psi X$
  - $\psi \sim N(\mu_{\psi}, \sigma_{\psi}^2)$
- Profits:  $P = X\tilde{r} q(\psi_1 X + \psi_0 X)$ 
  - ▶ Where q=1 for buy and q=-1 for sell

#### Intuition

• Arbitrageur has to initiate a trade and exit to profit.

• Profits: 
$$P = X\tilde{r} - q(\psi_1 X + \psi_0 X)$$

• Execution cost at exit  $\psi_1$  is unknown at initiation

## Why does uncertain $\psi_1$ matter?

- Arbitrageurs might be unable to time liquidity
  - Subject to outflow from investors Shleifer and Vishny (1997)
- Arbitrageurs might have to sell when liquidity is low
  - Price Pressure in stocks held by extreme outflows MFs Coval and Stafford (2007)

#### Arbitrageur Demand

Arbitrageur demand is given by

$$X = \frac{\mu_r - q(\mu_\psi + \psi_0)}{\gamma(\sigma_r^2 + \sigma_\psi^2)}$$
(1)

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- Investment in risky asset
  - Decreases with variation in liquidity

#### Equilibrium

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• Equilibrium returns

$$\mu_r = \gamma (\sigma_r^2 + \sigma_\psi^2) Y + q(\mu_\psi + \psi_0)$$
(2)

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$$Y = (1 - k)S - Z$$

- +ve for underpriced stocks
- -ve for overpriced stocks
- Relationship between  $\mu_r$  and  $\sigma_\psi^2$  depends on sign on Y

# Hypothesis

- Mispricing severe when variation in liquidity is high
  - Arbitragers take less position
  - Prices deviate and mispricing is severe
- Among overpriced stocks
  - High variation in liquidity most overpriced
- Among underpriced stocks
  - High variation in liquidity most underpriced

### Measures of variation in liquidity

- Primary measure
  - TURNVOL: Std Dev of monthly TURNOVER
- Other Measures
  - DTURNVOL: Std Dev of daily TURNOVER
  - AMIHUDVOL: Std Dev of Amihud Illiquidity
  - CVTURN: TURNVOL/TURN

# Mispricing Measure: Mispricing Scores

- Stambaugh, Yu, and Yuan (2015) mispricing score
  - Net stock issues
  - Composite equity issues
  - Accruals
  - Net Operating Assets
  - Asset Growth
  - Investment-to-Assets
  - Distress
  - O-score
  - Momentum
  - Gross Profitability Premium
  - Return on Assets

# Methodology

- Each month, sort stocks independently into quintiles
  - MISPRICING
  - TURNVOL
- Use Fama and French 5 factors for risk adjustment
- Standard errors corrected for heteroskedasticity

# Main Results: Mispricing and TURNVOL

#### Mispricing increases with TURNVOL

	TURNVOL						
Mispricing	Low	2	3	4	High	High - Low	
Low	-0.04%	-0.01%	0.43%	0.39%	0.50%	0.53%	
	(-0.49)	(-0.15)	(4.98)	(3.37)	(2.96)	(2.87)	
2	-0.12%	-0.09%	-0.02%	0.30%	0.53%	0.65%	
	(-1.43)	(-1.29)	(-0.26)	(2.87)	(3.02)	(3.41)	
3	-0.19%	-0.02%	-0.12%	0.04%	0.36%	0.55%	
	(-1.80)	(-0.22)	(-1.45)	(0.38)	(2.57)	(2.80)	
4	-0.17%	-0.28%	-0.10%	-0.21%	0.02%	0.19%	
	(-1.51)	(-2.82)	(-0.99)	(-1.88)	(0.14)	(0.99)	
High	-0.21%	-0.21%	-0.42%	-0.58%	-1.00%	-0.79%	
	(-1.63)	(-1.52)	(-3.56)	(-4.98)	(-7.36)	(-4.20)	
Low - High	0.17%	0.19%	0.85%	0.97%	1.49%	1.32%	
	(1.20)	(1.11)	(5.53)	(5.37)	(6.82)	(5.15)	

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## Sentiment and Mispricing

- Degree of overpricing varies with sentiment
  - Stambaugh, Yu, and Yuan (2012)
- When arbitrage is hindered, sentiment drives mispricing
- Following High Sentiment Months
  - Mispricing more severe compared to Low Sentiment Months
- Use Baker and Wrugler (2006) investor sentiment measure

#### Specification

• High sentiment months  $(d_H = 1)$ 

Months with sentiment higher than median

• Split the sample based on sentiment previous month.

Specification

$$R_{it} = a_L \ d_{Lt} + a_H \ d_{Ht} + b \ MKT_t + c \ SMB_t + d \ HML_t + e \ CMA_t + f \ RMW_t + \epsilon_{it}$$
(3)

# Sentiment and Mispricing

- During High Sentiment months
  - No change in underpriced returns
  - Overpriced High TURNVOL stocks earn even lower returns

	Low Sentiment Months			High - Low Sentiment Months		
	TURNVOL				TURNV	OL
Mispricing	Low	High	High - Low	Low	High	High - Low
Low	-0.08%	0.40%	0.48%	0.07%	0.23%	0.17%
	(-0.91)	(1.92)	(2.08)	(0.46)	(0.78)	(0.48)
High	-0.39%	-0.79%	-0.40%	0.39%	-0.38%	-0.76%
	(-2.25)	(-4.31)	(-1.54)	(1.58)	(-1.51)	(-2.10)
Low - High	0.31%	1.19%	0.88%	-0.32%	0.61%	0.93%
	(1.53)	(4.44)	(2.73)	(-1.16)	(1.53)	(1.95)

# Variation in Liquidity and Average Returns

- Stocks with higher variation in liquidity earn lower returns
  - Chordia, Subrahmanyam, and Anshuman (2001)
  - If liquidity varies, risk averse investors should require compensation (Amihud, Mendelson, and Pedersen 2005)
- Potential Explanations
  - Weak evidence of heterogeneity in investors Chordia, Subrahmanyam, and Anshuman (2001)
  - Valuable option if investors can time trades with liquidity -Pereira and Zhang (2010)

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Costly Arbitrage ?

## Individual stock regression

- Follow Brennan, Chordia, and Subrahmanyam (1998)
- · First compute risk adjusted return of individual stocks
- Control for characteristics in Fama-Macbeth
  - ► SIZE, BM, 1/PRICE, RET23, RET46, RET712

### Fama Macbeth

 No relationship between TURNVOL and returns after controlling for mispricing.

Variables	Excess Returns	Excess Returns
In(SIZE)	-0.151***	-0.141***
	(0.018)	(0.018)
1/PRICE	0.299***	0.351***
	(0.055)	(0.055)
RET23	0.655***	0.485*
	(0.248)	(0.249)
In(TURNVOL)	-0.300***	-0.098
	(0.039)	(0.072)
MISPRICING		-0.030***
		(0.006)
MISPRICING $\times$ In(TURNVOL)		-0.004**
		(0.001)

• Other Controls: Ln(BM), RET46, RET712, IVOL, Ln(TURN)

# Arbitrage Asymmetry

- Overpricing on average when arbitrage is hindered
  - Stambaugh, Yu, and Yuan (2015)
  - Difficult to short stocks due to short sale constraints
  - This creates asymmetry in arbitrage
  - Arbitrageurs allocate more capital to correct underpricing
  - Results in overpricing on average

## Controlling for IVOL

- Control for IVOL by 3x3x3 sort
- Mispricing still severe in High TURNVOL Stocks

	Low IVOL			High IVOL			
	TURNVOL				TURNVOL		
Mispricing	Low	High	High - Low	Low	High	High - Low	
Low	-0.08%	0.36%	0.44%	0.08%	0.20%	0.12%	
	(-1.28)	(3.49)	(3.56)	(0.67)	(1.15)	(0.64)	
High	-0.09%	-0.29%	-0.20%	-0.53%	-1.12%	-0.59%	
	(-0.80)	(-2.99)	(-1.36)	(-3.51)	(-6.19)	(-2.90)	
Low - High	0.01%	0.65%	0.64%	0.61%	1.32%	0.71%	
	(0.06)	(4.44)	(3.64)	(3.07)	(5.68)	(2.91)	

## Conclusion

- Arbitragers worry about uncertainty in liquidity
- Reduce their exposure to stocks with high variation in liquidity
- Mispricing severe in stocks with high variation in liquidity
- Limited arbitrage explains -ve return between variation in liquidity and returns