# Benchmarking Intensity

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#### Motivation

- ► The asset management industry has been growing in size and importance over time.
- ▶ Benchmarks convey to fund investors information about the types of stocks the fund invests in and act as a useful tool for performance evaluation of fund managers
- ▶ Our objective is to link membership in multiple benchmarks to stock prices and expected returns, as well as the demand by fund managers

#### Literature

- ▶ This paper is related to several strands of literature, including equilibrium asset pricing with benchmarked fund managers, index effect, and empirical research on the effects of institutional ownership.
  - ▶ Benchmark: None of these works, however, considers heterogeneous benchmarks (Brennan, 1993; Cuoco and Kaniel, 2011; Basak and Pavlova, 2013); Buffa et al., Forthcoming).
  - ▶ Index effect: This literature typically measures the average size of index effect (Shleifer, 1986; Harris and Gurel, 1986). The existence of the index effect challenges the standard theories which predict that demand curves for each stock are very elastic (Gabaix and Koijen, 2020).

### Contribution

- Among theoretical contributions, heterogeneous habitats of fund managers arise because of the heterogeneity in benchmarks. Our preferred habitat model provides a microfoundation for why stocks are imperfect substitutes.
- ▶ Both theoretical and empirical results are related to the index effect literature, we show how it varies in the cross-section with the change in BMI.
- ▶ Among empirical contributions, Our analysis delivers an alternative estimate of stock price elasticity of demand and implications of passive ownership for corporate governance.

# Model - Basic Setting

There are two periods, t = 0, 1. The financial market consists of a riskless asset with an exogenous interest rate normalized to zero. The cash flows of the risky assets are given by

$$D_i = \bar{D}_i + \beta_i Z + \epsilon_i, \beta_i > 0, i = 1, ..., N,$$

where  $Z \sim N(0, \sigma_z^2)$  is common shock and  $\epsilon_i \sim N(0, \sigma_z^2)$  is idiosyncratic.

- ▶ The terminal wealth of a direct investor is given by  $W = W_0 + \theta_D'(D-S)$ ,
- $\triangleright$  A fund manager's j compensation  $w_i$  consists of three parts

$$w_i = aR_i + b(R_i - B_i) + c, a \ge 0, b > 0$$

where  $R_j \equiv \theta'_j(D-S)$  is the performance of the fund's portfolio and

$$B_j \equiv \omega_j'(D-S)$$
 is the performance of benchmark j

# Model - Portfolio choice and asset prices

➤ The portfolio demand of the direct investors is the standard mean-variance portfolio

$$\theta_D = \frac{1}{\gamma} \Sigma^{-1} (\bar{D}_i - S)$$

► The portfolio demand of manager j is given by,

$$\theta_j = \frac{1}{\gamma(a+b)} \Sigma^{-1} (\bar{D}_i - S) + \frac{b}{a+b} \omega_j$$

▶ The fund manager splits his risky asset holdings across two portfolios: the mean-variance portoflio and the benchmark portfolio. The latter portfolio arises because the manager hedges against underperforming the benchmark.

#### Model - Market Clear

▶ By clearing markets for the risky assets,  $\lambda_D \theta_D + \sum_{j=1}^J \lambda_j \theta_j = \bar{\theta}$ , we compute equilibrium asset prices.

$$S = \bar{D} - \gamma A \Sigma \left( \bar{\theta} - \frac{b}{a+b} \sum_{j=1}^{J} \lambda_j \omega_j \right)$$

The index effect manifests itself through the benchmarking-induced price pressure term  $\frac{b}{a+b} \sum_{i=1}^{J} \lambda_i \omega_i$ .

▶ The expected return of stock i, expressed as

$$E[\Delta S_i] = \gamma A \beta_i \sigma_z^2 \beta' \left( \bar{\theta} - \frac{b}{a+b} \sum_{i=1}^J \lambda_j \omega_j \right) + \gamma A \sigma_\epsilon^2 \left( \bar{\theta}_i - \frac{b}{a+b} \sum_{i=1}^J \lambda_j \omega_{ij} \right)$$

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#### Model Prediction

- ▶ Stocks with higher benchmarking intensities have lower expected returns.
- ▶ If a stock's benchmarking intensity goes up (e.g., because of an index inclusion), its price should rise.
- ▶ If a stock's benchmarking intensity goes up, the funds' ownership of the stock  $(\sum_i \theta_{ij})$  should rise.
- ▶ If a stock enters benchmark j and exits benchmark k, funds benchmarked to index j increase their demand for the stock  $(\theta_{ij})$  while those benchmarked to index k decrease their demand  $(\theta_{ik})$ .

### Data

- The main sample is an annual panel of stocks which were the Russell 3000 constituents in 1998-2018. All the constituent weights for 22 Russell benchmark indexes are from FTSE Russell
- ► The main three pillars of data are historical benchmark weights, fund and institutional holdings, and stock characteristics
- ► Focus on U.S. domestic equity mutual funds and ETFs and their prospectus benchmarks to build a measure of benchmarking intensity

# Empirical measure of benchmarking intensity

• we calculate the benchmarking intensity (BMI) for stock i in month t as

$$BMI_{it} = \frac{\sum_{j=1}^{J} \lambda_{jt} \omega_{ijt}}{MV_{it}}$$

where  $\lambda_{it}$  is AUM of mutual funds and ETFs benchmarked to index j in month t,  $\omega_{ijt}$  is the weight of stock i in index j in month t and  $MV_{it}$  is the market capitalization of stock i in month t

Furthermore, stock weight in any value-weighted index j is

$$\omega_{ijt} = \frac{MV_{it}1_{ijt}}{\sum_{k=1}^{N} MV_{kt}1_{kit}} = \frac{MV_{it}1_{ijt}}{IndexMV_{jt}}$$

Hence, an additional advantage of this scaling of our theoretical measure

$$BMI_{it} = \sum_{j=1}^J rac{\lambda_{it} \mathbf{1}_{ijt}}{\sum_{\substack{k=1 \ \mathrm{i} 
eq i}}^N MV_{kt} \mathbf{1}_{kjt}} = rac{\lambda_{it} \mathbf{1}_{ijt}}{Index MV_{jt}}$$

#### BMI and index effect

• we show stocks with larger changes in BMI have higher returns in June

$$Ret_{it}^{June} = \alpha \Delta BMI_{it} + \xi log MV_{it} + \phi^{'}Controls_{it} + \tau Float_{it} + \delta^{'}\bar{X}_{it} + \mu_{t} + \epsilon_{it}$$

 $Ret_{it}^{June}$  is the return of stock i in June of year t, winsorized at 1%.  $BMI_{it}$  is the difference between the BMI of stock i in May of year t and its BMI in June of the same year

▶ Consistent with our model's Prediction 2, price pressure is the highest for stocks experiencing the largest increase in BMI, all else equal

# BMI change and return in June

- ▶ Price pressure is the highest for stocks having the largest increase in BMI
- ▶ The size of index effect is proportional to the stock's BMI change

	Return in June					$\Delta BMI,\%$
	(1)	(2)	(3)	(4)	(5)	(6)
$\Delta BMI$	0.26** (2.55)	0.27**	0.28** (2.74)			
$1(\Delta BMI \text{ quartile } 1)$	(=:==)	(====)	(=::-,	-0.010*** $(-3.41)$	-0.010*** (-3.39)	-3.02
$1(\Delta BMI \text{ quartile } 2)$				-0.004** (-2.16)	-0.005*** (-2.67)	-0.39
$1(\Delta BMI \text{ quartile } 3)$				0.006***	0.005***	0.49
$1(\Delta BMI \text{ quartile 4})$				0.008** (2.26)	0.009*** (2.64)	3.24
Fixed effect	Year	Year	Stock & year	N	N	
$\bar{X}$ controls	N	Y	Y	N	Y	
Observations	14,549	14,549	14,549	14,549	14,549	
Adj. $R^2$ , %	17.1	17.5	19.2	1.3	1.8	

# Implications for the price elasticity of demand

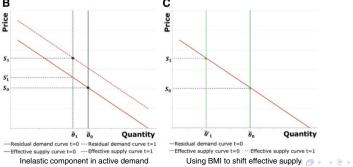
- ▶ Most of the existing literature implicitly assumes that active investor demand is fully elastic. Using the change in passive benchmarked assets to measure the price elasticity of demand as  $(\tilde{\theta_1} - \tilde{\theta_0})/(S_1 - S_0) \times S_0/\tilde{\theta_0}$
- ▶ The demand of passive managers benchmarked to index j for any particular stock is fully inelastic. Then, the effective supply of shares available to benchmarked active managers and direct investors is  $\tilde{\theta} = \bar{\theta} - \sum_{i} \lambda_{i}^{P} \omega_{i}$
- ▶ Aggregate demand function of benchmarked active managers and direct investors

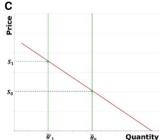
$$\Theta^{Active+Direct} = \frac{1}{\gamma} A^{-1} \Sigma^{-1} (\bar{D} - S) + \frac{b}{a+b} \sum_{j} \lambda_j^A \omega_j$$

#### Demand curves and index effect

▶ One could separate elastic and inelastic components of active managers' demand and subtract the latter from the effective supply

$$\tilde{\theta}' = \bar{\theta} - \left[ \sum_{j} \lambda_{j}^{P} \omega_{j} + \frac{b}{a+b} \sum_{j} \lambda_{j}^{A} \omega_{j} \right]$$





#### BMI as an IV

▶ We estimate price impact of benchmarked investors' trades by examining directly how changes in their ownership of a stock affect the stock's price.

$$Ret_{it}^{June} = \alpha \Delta IO_{it} + \epsilon_{it}$$

The change in IO is an equilibrium object and hence is endogenous

▶ The skewness increases with the return measurement horizon, and the percentage of funds that outperform the SPY declines

$$\Delta IO_{it}^{June} = \alpha \Delta BMI_{it} + \xi_1 log MV_{it} + \phi_1' Control_{it} + \tau_1 Float_{it} + \delta_1' \bar{X}_{it} + \mu_{1t} + \epsilon_i$$

$$Ret_{it}^{June} = \alpha \Delta \hat{I}O_{it} + \xi log MV_{it} + \phi' Control_{it} + \tau Float_{it} + \delta' \bar{X}_{it} + \mu_{2t} + \epsilon_{it}$$

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#### BMI as an IV

► To further alleviate concerns about the possible endogeneity of BMI, we conduct overidentifying restrictions tests

#### Change in BMI as an instrument for change in institutional ownership

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		Return i	Return in April-June, %		
	OLS			2SLS	
	(1)	(2)	(3)	(4)	(5)
A. Second-stage estimates					
$\Delta IO$ , %	0.09***	2.27	1.46**	1.47**	2.26**
	(3.75)	(1.44)	(2.55)	(2.57)	(2.80)
B. First-stage estimates	(		( )	, , ,	, , ,
$\Delta BMI$ , %			0.20***	0.19***	0.19***
, .			(5.90)	(6.34)	(6.43)
$D^{R2000}$		0.85***	-0.15	,	( )
_		(2.78)	(-0.54)		
F-stat (excl. instruments)		7.73	20.07	40.20	41.41
Hansen J test, p-value		7.75	.19	10.20	
Controls	Y	Y	Y	Y	N
Observations	12,862	12,862	12,862	12,862	12,862

## BMI adjusted for fund activeness

▶ Our model, however, implies that passive and active funds should contribute to BMI differently

$$BMI^{w} = BMI^{Passive} + \frac{b}{a+b}BMI^{Active}$$

	$\alpha$ estimate		t-statistic	Adj. $R^2$ , %	Implied elasticity	
$\frac{b}{a+b}$	$\frac{\Delta BMI^w}{(1)}$	$0.5 \times \Delta BMI^{w}$ (2)	(3)	(4)	$ \frac{\Delta BMI^w}{(5)} $	$0.5 \times \Delta BMI^{w}$ (6)
1.0	0.27**	0.54**	(2.66)	17.53	-3.69	-1.85
0.8	0.32**	0.65**	(2.64)	17.51	-3.09	-1.54
0.6	0.40**	0.81**	(2.62)	17.49	-2.48	-1.23
0.4	0.53**	1.06**	(2.58)	17.44	-1.89	-0.94
0.2	0.74**	1.47**	(2.50)	17.34	-1.36	-0.68
0.0	0.72**	1.45**	(2.29)	17.04	-1.38	-0.69

### Net purchases of index additions and deletions

➤ To see which funds rebalance additions and deletions, we estimate the following equations

$$\Delta Own_{ijt} = \alpha_{1j} D_{it}^{R1000 - R2000} + \alpha_{2j} D_{it}^{R2000 - R1000} + \xi_1 log M V_{it} + \tau_1 Float_{it} + \delta_1' \bar{X}_{it}$$

$$Own_{ijt} = \alpha_j D_{it}^{R2000} + \phi_j Own_{ijt-1} + \xi_1 log M V_{it} + \tau_1 Float_{it} + \delta_1' \bar{X}_{it} + \mu_{1t} + \epsilon_{it}$$

In the above equations,  $D_{it}^{R1000-R2000}$  equals one when stock i is moved from the Russell 1000 to Russell 2000 on the reconstitution day in June of year t.

### Net purchases of index additions and deletions

▶ Russell benchmarks serve as both active and passive funds' preferred habitats.

Change in the aggregate ownership of funds with the same benchmark

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		Stocks rar	nked < 1000		Stocks rai	nked > 1000	
Benchmark	Russe	11 1000	Russell	Midcap	Russe	ell 2000	
Fund type	Active	Passive	Active	Passive	Active	Passive	
A. Change in own	ership share						
$D^{R2000} \rightarrow R1000$	0.122***	0.105***	0.394***	0.113***	-0.546***	-0.840***	
	(2.97)	(3.60)	(4.41)	(3.16)	(-4.95)	(-4.18)	
$D^{R1000 \to R2000}$	-0.101**	-0.100***	-0.264***	-0.103***	0.123	0.771***	
	(-2.22)	(-3.29)	(-3.69)	(-2.90)	(1.47)	(3.61)	
B. Change in hold	ling status						
$D^{R2000 \to R1000}$	0.356***	0.459***	0.288***	0.437***	-0.319***	-0.921***	
	(7.05)	(7.93)	(5.02)	(5.20)	(-7.13)	(-11.47)	
$D^{R1000 \to R2000}$	-0.298***	-0.828***	-0.237***	-0.694***	0.113**	0.829***	
	(-4.68)	(-5.84)	(-5.62)	(-4.27)	(2.39)	(6.87)	
C. Ownership sha	ire						
$D^{R2000}$	-0.032	-0.067**	-0.136**	-0.065*	0.267**	0.653***	
	(-1.05)	(-2.42)	(-2.24)	(-1.90)	(2.50)	(3.01)	
D. Holding status							
$D^{R2000}$	-0.177***	-0.351***	-0.057***	-0.651***	0.002	0.613***	
	(-8.91)	(-6.72)	(-4.92)	(-4.72)	(0.45)	(13,06) → ← ≣ → ← ≣ → □	Q (
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# BMI and long-run returns

- ▶ In this section, we show that a higher benchmarking intensity leads to lower returns in the long run.
- $\triangleright$  As earlier, we employ a stock-level specification to estimate  $\alpha$ :

$$Y_{it+h} = \alpha \Delta BMI_{it} + \xi_1 log MV_{it} + \phi_1' Control_{it} + \tau_1 Float_{it} + \delta_1' \bar{X}_{it} + \mu_t + \mu_i + \epsilon_{it}$$

Specifically, we consider the 12-, 24-, 36-, 48-, and 60-month excess returns, which are not risk-adjusted

### BMI and long-run returns

- ▶ As the coefficient on BMI is significantly negative, stocks with an increase in benchmarking intensities have lower returns in the future.
- ▶ Inelastic demand from the benchmarked institutions lowers the stock risk premium.

	Excess returns, average over horizon								
Horizon (months)	12	24	36	48	60				
A: All baseline contre	ols								
$\Delta BMI$	-0.045**	-0.037***	-0.020***	-0.016**	-0.009**				
	(-2.81)	(-3.63)	(-3.87)	(-2.75)	(-2.16)				
Observations	13,813	12,318	10,928	9,731	8,633				
B: Baseline controls	without stock fixed	effects							
$\Delta BMI$	-0.039*	-0.034**	-0.016**	-0.015**	-0.010				
	(-1.86)	(-2.50)	(-2.31)	(-2.18)	(-1.58)				
Observations	14,351	12,800	11,388	10,091	8,988				
C: LogMV, Float a	nd BandingContr	ols only							
$\Delta BMI$	-0.039**	-0.034***	-0.020***	-0.016***	-0.011***				
	(-2.69)	(-3.63)	(-4.52)	(-3.23)	(-3.15)				
Observations	14,700	13,124	11,605	10,279	9,082				

#### Robustness

- ▶ Arbitrage limitation: Suppose that there is not enough arbitrage capital in June to prevent the index effect.
- ► Cash flow channel: Our model assumes that firms' cash flows are fixed and a change in BMI affects firm value through the discount rate.
- ▶ Liquidity premium: Stocks added to the Russell 2000 benefit from improved liquidity.
- ► Financial distress: Firms that have transitioned to the Russell 2000 are lower because these firms have fallen on hard times and their cash flows are deteriorating

#### Conclusions

- ▶ In this paper, we propose a measure that captures inelastic demand for a stock —benchmarking intensity, and document the effects of a change in BMI on stock prices, expected returns, ownership, and demand elasticities.
  - According to our preferred habitat view, active funds are not genuinely active investors.
  - ▶ We find evidence of the inelastic demand of active managers in the ownership data
  - ▶ Price pressure is the highest for stocks having the largest increase in BMI