

# Passive Investing and the Rise of Mega-Firms

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## Growth of Passive Investing

- US equity index mutual funds and index ETF in 1993:
  - AUM \$23 billion.
  - 3.7% of combined active and passive.
  - 0.44% of US stock market.
  
- US equity index mutual funds and index ETF in 2021:
  - AUM \$8.4 trillion.
  - 53% of combined active and passive.
  - 16% of US stock market.
  
- 42% of index mutual funds track S&P500 index.
  
- What are effects on asset prices and the real economy?

- Flows into passive funds tracking capitalization-weighted indices:
  - Raise disproportionately prices of *largest* stocks within the indices.
    - Example: Inflows into S&P500 passive funds → Higher returns for largest S&P500 stocks than smaller S&P500 stocks.
  - *Raise* largest stocks' return volatility and price sensitivity to cashflow news.
  - If stocks are mispriced because of noise traders → Passive flows raise disproportionately prices of *overvalued* stocks within the indices' largest.
- → Passive investing is *not neutral*.
  - Reduces primarily cost of capital of largest firms.
  - Makes size distribution of firms more skewed.
- Provide empirical evidence in support of model's predictions.

## Passive Flows in CAPM World

- Suppose that index tracked by passive funds is market portfolio.
- If passive flows are due to increased market participation:
  - Market risk premium drops.
  - → Stock prices rise, especially for high CAPM beta stocks.
  - Small stocks have higher CAPM beta than large stocks → Higher returns for small stocks than for large stocks.
- If passive flows are due to switch from active to passive:
  - No effect on stock prices because active and passive funds hold same portfolio.

## Intuition

- CAPM logic fails to account for flows' effect on price volatility.
- Assume:
  - A stock is in high demand by noise traders (return to CAPM world later).
  - Additional demand generated by passive flows induces smart-money investors to short the stock.
- → Stock's price rises.
- → Stock's price becomes more sensitive to cashflow shocks.
  - Positive shock to stock's cashflows → Stock accounts for larger fraction of market movements → Smart-money investors buy the stock to reduce risk.
- High price sensitivity → High volatility → Smart-money investors become even more willing to buy the stock → Price and price sensitivity rise → ...
- Mechanism is quantitatively significant for large stocks, as their idiosyncratic risk is non-negligible.

**Model**

## Assets

- Continuous time  $t$  goes from zero to infinity.
- Riskless asset, exogenous return  $r > 0$ .
- $N$  stocks  $n = 1, \dots, N$ . Stock  $n$  is in supply of  $\eta_n > 0$  shares and pays dividend flow per share

$$D_{nt} = \bar{D}_n + b_n D_t^s + D_{nt}^i$$

- $\bar{D}_n \geq 0$ : Constant component.
- $b_n D_t^s$ : Systematic component. Systematic factor  $D_t^s$  follows square-root process

$$dD_t^s = \kappa^s (\bar{D}^s - D_t^s) dt + \sigma^s \sqrt{D_t^s} dB_t^s$$

with  $(\kappa^s, \bar{D}^s, \sigma^s)$  positive and  $b_n$  non-negative.

- $D_{nt}^i$ : Idiosyncratic component, follows square-root process

$$dD_{nt}^i = \kappa_n^i (\bar{D}_n^i - D_{nt}^i) dt + \sigma_n^i \sqrt{D_{nt}^i} dB_{nt}^i.$$

with  $\{\kappa_n^i, \bar{D}_n^i, \sigma_n^i\}_{n=1, \dots, N}$  positive, and  $(B_t^s, \{B_{nt}^i\}_{n=1, \dots, N})$  mutually independent.

- Normalizations:  $\bar{D}^s = 1$  and  $\bar{D}_n + b_n + \bar{D}_n^i = 1$ .
- Square-root process: Tractable specification that ensures:
  - Positive prices.
  - Volatility of dividend per share *increases* with dividend level.

- Experts (active investors).
  - Can invest in all stocks without constraints.
  - Maximize  $\mathbb{E}_t(dW_{1t}) - \frac{\rho}{2}\text{Var}_t(dW_{1t})$  over number of shares  $\{z_{1nt}\}_{n=1\dots N}$  held in the stocks.
  - Measure  $\mu_1$ .
- Non-experts (passive investors).
  - Can invest in riskless asset and capitalization-weighted index that includes  $\eta'_n$  shares of stock  $n$ , where  $\eta'_n = \eta_n$  for  $n \in \mathcal{I}$  and  $\eta'_n = 0$  for  $n \notin \mathcal{I}$ .
  - Maximize  $\mathbb{E}(dW_{2t}) - \frac{\rho}{2}\text{Var}(dW_{2t})$  over fraction  $\lambda$  held in the index.
  - Measure  $\mu_2$ .
- Noise traders demand inelastically  $u_n$  shares of asset  $n$ .
  - Noise traders are not essential for main results.
- Model builds on Buffa-Vayanos-Woolley (JPE 2022).
  - Introduce correlation across stocks and a size distribution of stocks.



# Equilibrium

## Equilibrium Prices

- Proposition:** Price of stock  $n$  is

$$S_{nt} = \underbrace{\frac{\bar{S}_n}{r}}_{\text{PV of constant component, } \bar{S}_n} + \underbrace{b_n a_1^s \frac{\kappa^s + r D_t^s}{r}}_{\text{PV of systematic component, } b_n S^s(D_t^s)} + \underbrace{a_{n1}^i \frac{\kappa_n^i \bar{D}_n^i + r D_{nt}^i}{r}}_{\text{PV of idiosyncratic component, } S_n^i(D_{nt}^i)},$$

where

$$a_1^s = \frac{2}{r + \kappa^s + \sqrt{(r + \kappa^s)^2 + 4\rho \left( \sum_{m=1}^N \frac{\eta_m - \mu_2 \lambda \eta'_m - u_m}{\mu_1} b_m \right) (\sigma^s)^2}},$$

$$a_{n1}^i = \frac{2}{r + \kappa_n^i + \sqrt{(r + \kappa_n^i)^2 + 4\rho \frac{\eta_n - \mu_2 \lambda \eta'_n - u_n}{\mu_1} (\sigma_n^i)^2}},$$

and  $\lambda > 0$  solves scalar equation.

- Price *and* price sensitivity to dividend shocks are decreasing in:
  - Systematic supply  $\left( \sum_{m=1}^N \frac{\eta_m - \mu_2 \lambda \eta'_m - u_m}{\mu_1} b_m \right) (\sigma^s)^2$ .
  - Idiosyncratic supply  $\frac{\eta_n - \mu_2 \lambda \eta'_n - u_n}{\mu_1} (\sigma_n^i)^2$ .

## Price Sensitivity and Supply – Intuition

- Positive shock to dividends of stock  $n$
- → Expected future dividends rise *and* become riskier (square-root process).
- If supply is positive (experts hold a long position)
  - → Experts become more willing to sell stock  $n$  to reduce risk
  - → Stock price increases less than when supply is zero.
- If supply is negative (experts hold a short position)
  - → Experts become more willing to buy stock  $n$  to reduce risk
  - → Stock price increases more than when supply is zero.
- Difference with standard CARA-normal models.
  - Supply affects price but not price sensitivity.

## Calibrated Example

## Parameter Values – Active vs. Passive and Size Distribution

- Normalizations:
  - $\mu_1 + \mu_2 = 1$  in baseline case.
  - $\rho = 1$ .
- $r = 3\%$ .
- $\mu_1$  and  $\mu_2$ .
  - $\mu_1 = 0.9, \mu_2 = 0.1$  in baseline case. Passive 10% of active plus passive.
  - Raise  $\mu_2$  to 0.6. Two polar cases:
    - Passive flows due to increase in market participation.  $\mu_1 = 0.9, \mu_2 = 0.6$ .
    - Passive flows due to switch from active to passive.  $\mu_1 = 0.4, \mu_2 = 0.6$ .
- Size distribution of firms.
  - Based on market-cap distribution in US stock market.
  - Ten stocks in supply of  $3125 \times \eta$  shares each. Size group 1. (Avg = \$1tn)
  - 50 stocks in supply of  $625 \times \eta$  shares each. Size group 2. (Avg = \$207bn)
  - 250 stocks in supply of  $25 \times \eta$  shares each. Size group 3. (Avg = \$48.1bn)
  - 1250 stocks in supply of  $5 \times \eta$  shares each. Size group 4. (Avg = \$6.71bn)
  - 1250 stocks in supply of  $\eta$  shares each. Size group 5. (Avg = \$815mn)

## Parameter Values – Noise Traders, Index, Dividend Processes

- Noise traders.
  - Absent in baseline case.
  - Alternative: Noise-trader demand equal to zero for half of stocks in each size group and to 40% of shares issued for remaining stocks.
- Index.
  - Includes all stocks in baseline case.
  - Alternative: Includes only stocks in size groups 3, 4 and 5. (S&P500)
- Dividend processes.
  - $\kappa^s = \kappa_n^i \equiv \kappa$  for all  $n$ .
  - $\bar{D}_n^i \equiv \bar{D}^i$  and  $\sigma_n^i = \sigma^i$  for all  $n$ .
  - $\frac{\sigma^i}{\sqrt{\bar{D}^i}} = \frac{\sigma^s}{\sqrt{\bar{D}^s}} = \sigma^s$ . Distributions of  $D_t^s$  and  $D_{nt}^i$  same when scaled by their long-run means.
  - $b_n = \bar{b} - (m - 3)\Delta b \geq 0$  for size group  $m$ . Size negatively related to CAPM beta when  $\Delta b > 0$ .

## Parameter Values – Dividend Processes and Supply

- $\Delta b = 0.025$ . Spread in CAPM betas between size groups 1 and 5 is 0.40.
  - Fama-French (JF 1992): Spread is 0.45.
- $\bar{b} + 2\Delta b + \bar{D}^i = 1$ . Minimize constant  $\rightarrow$  Maximize return volatility.
- $\bar{b} = 0.85$ ,  $\Delta b = 0.025$ ,  $\bar{D}^i = 0.10$ . CAPM  $R$ -squared averages to 22.69% across stocks, and to 26.83% when weighted by size.
  - Respective averages for stocks in CRSP universe are 16.7% and 27.1%.
- $\eta = 0.00003$ . Expected excess returns across size groups lie between 4-6%.
- $\sigma^s$  maximizes return volatility.
  - Volatility ranges from 21.12% for size group 1 to 11.58% for size group 5.
  - Not high enough. (Raising  $\sigma^s$  shifts weight to very small or very large values of  $D_t^s$ , for which volatilities are low.)
  - Raising volatility strengthens our results.

## No Noise Traders

- Return moments in baseline case.

Size Group	Expected Return (%)	Return Volatility (%)	CAPM Beta	CAPM $R^2$ (%)
1 (Smallest)	5.61	21.12	1.35	22.68
2	4.94	18.19	1.16	22.45
3	4.45	16.01	1.02	22.70
4	4.17	13.98	0.95	25.79
5 (Largest)	4.09	11.58	0.95	37.21



## Passive Flows and Stock Prices

- % price change when  $\mu_2$  is raised to 0.6. Set  $D_t^s = \bar{D}^s = 1$ ,  $D_{nt}^i = \bar{D}^i$ .

Size Group	Increase in Market Participation		Switch from Active to Passive	
	All Stocks in Index	Size Groups 3-5 in Index	All Stocks in Index	Size Groups 3-5 in Index
1 (Smallest)	6.51	6.36	0	-0.52
2	5.60	5.32	0	-1.05
3	5.44	5.70	0	1.08
4	6.54	7.62	0	3.97
5 (Largest)	7.71	9.90	0	7.23

- Increase in market participation:
  - Effect is *J-shaped* with size.
  - More so if index includes only medium and large stocks.
- Switch from active to passive:
  - No effect if index includes all stocks.
  - Otherwise:
    - Effect increases with size.
    - Effect is *asymmetric*: aggregate market rises.

## Intuition – Present Values

- Assume increase in market participation.
- % price change is

$$\frac{1}{S_{nt}} \frac{\partial S_{nt}}{\partial(\mu_2\lambda)} = \frac{b_n \frac{\partial S^s(\bar{D}^s)}{\partial(\mu_2\lambda)} + \frac{\partial S_n^i(\bar{D}_n^i)}{\partial(\mu_2\lambda)}}{\bar{S}_n + b_n S^s(\bar{D}^s) + S_n^i(\bar{D}_n^i)}$$

- Small and mid-size stocks:
  - Passive flows do not affect PV of idiosyncratic component ( $\frac{\partial S_n^i(\bar{D}_n^i)}{\partial(\mu_2\lambda)} \approx 0$ ).
    - Small and mid-size stocks account for negligible fraction of market movements  
→ Idiosyncratic dividends are discounted at riskless rate.
  - Passive flows raise PV of systematic component.
    - More so for higher  $b_n$  stocks → Decreasing part of  $J$ -shape.
- Large stocks:
  - Passive flows raise PV of both systematic and idiosyncratic component.
    - Large stocks account for non-negligible fraction of market movements.
    - → Increasing part of  $J$ -shape.

## Intuition – Effect of Volatility

- Why is effect of passive flows not subsumed into CAPM beta?
- Effect holding price sensitivity constant → Proportional to CAPM beta.
- Effect accounting for change in price sensitivity → Gives greater weight to part of beta caused by idiosyncratic component of dividends.
  - Systematic supply.
    - Passive flows raise price sensitivity to shocks to systematic component.
    - → Volatility increase attenuates price rise caused by reduction in systematic supply.
  - Idiosyncratic supply.
    - Attenuation effect is weaker.
    - Volatility increase pertains to idiosyncratic supply which is smaller than systematic supply.
    - Attenuation effect is zero when idiosyncratic supply is zero, and negative (amplification) when idiosyncratic supply is negative.

## Passive Flows and Return Volatility

- Change in return volatility when  $\mu_2$  is raised to 0.6.

Size Group	Baseline Return Volatility	Change in Return Volatility			
		Increase in Market Participation		Switch from Active to Passive	
		All Stocks in Index	Size Groups 3-5 in Index	All Stocks in Index	Size Groups 3-5 in Index
1 (Smallest)	21.12	-0.04	-0.04	0	0
2	18.19	0.11	0.11	0	-0.03
3	16.01	0.22	0.23	0	0.06
4	13.98	0.39	0.46	0	0.28
5 (Largest)	11.58	0.65	0.83	0	0.66

- Return volatility rises for large stocks.
- Increase in price sensitivity to idiosyncratic component of dividends.

## Noise Traders

- Return moments.

Size Group	Noise-Trader Demand	Expected Return (%)	Return Volatility (%)	Market Beta	CAPM $R^2$ (%)
1 (Smallest)	Low	5.17	21.10	1.34	24.95
	High	5.17	21.10	1.34	24.93
2	Low	4.58	18.25	1.16	24.78
	High	4.58	18.25	1.16	24.69
3	Low	4.16	16.10	1.03	25.11
	High	4.13	16.16	1.02	24.70
4	Low	3.91	14.10	0.96	28.40
	High	3.84	14.31	0.95	26.88
5 (Largest)	Low	3.86	11.75	0.95	40.06
	High	3.73	12.19	0.94	36.72

- Noise trader demand affects mid-size and large stocks.
- Within each of these size groups, it generates negative risk-return relationship. High noise-trader demand:
  - Low expected return.
  - High volatility. High sensitivity to idiosyncratic component of dividends.

## Passive Flows and Stock Prices

- % price change when  $\mu_2$  is raised to 0.6. Set  $D_t^s = \bar{D}^s = 1$ ,  $D_{nt}^i = \bar{D}^i$ .

Size Group	Noise-Trader Demand	Increase in Market Participation		Switch from Active to Passive	
		All Stocks in Index	Size Groups 3-5 in Index	All Stocks in Index	Size Groups 3-5 in Index
1 (Smallest)	Low	6.97	6.83	-0.07	-0.87
	High	6.97	6.83	0.01	-0.80
2	Low	5.98	5.75	-0.18	-1.33
	High	5.97	5.73	0.13	-1.04
3	Low	5.66	5.84	-0.61	-0.18
	High	5.65	5.85	0.64	1.25
4	Low	6.36	7.12	-1.57	0.45
	High	6.72	7.77	2.28	6.78
5 (Largest)	Low	7.13	8.54	-2.09	0.91
	High	8.94	12.17	4.81	31.95

- Larger % price change for stocks in high noise-trader demand (overvalued).
  - Increase in price sensitivity to shocks to idiosyncratic component does not attenuate and can even amplify price increase for these stocks.
- Asymmetric effect. Aggregate market rises even when flows are pure reallocation from active to passive.

## Index Additions

- % price change and change in return volatility when a stock is added to the index. Set  $\mu_2 = 0.6$ .

Size Group	Noise-Trader Demand	Percentage Price Change		Change in Return Volatility	
		All Stocks in Index	Size Groups 3-5 in Index	All Stocks in Index	Size Groups 3-5 in Index
1 (Smallest)	Low	0.04	0.06	0.00	0.00
	High	0.04	0.06	0.00	0.00
2	Low	0.18	0.26	0.01	0.01
	High	0.19	0.26	0.01	0.01
3	Low	0.72	1.03	0.03	0.05
	High	0.77	1.10	0.04	0.05
4	Low	2.03	2.98	0.13	0.20
	High	2.64	3.92	0.17	0.25
5 (Largest)	Low	2.66	4.14	0.23	0.35
	High	5.03	8.42	0.41	0.68

- % price change is larger for larger and overvalued stocks.
- Change in volatility is larger for these stocks.

# **Empirical Evidence**



- Flows into S&P500 index mutual funds and plain-vanilla ETFs (= passive funds).
- Stock prices, returns and index composition are from CRSP.
- S&P500 index mutual fund assets and flows are from ICI. Top three S&P500 index ETFs (account for almost all ETFs).
- Measure passive flows by change in passive fund assets as % of S&P500.
  - Results are similar when using ICI-reported flows into passive funds.
- Sample period is 1996-2020. Periods are quarters.

## Returns – Large Stocks vs. Index

	Big-S&P EW	Big-S&P VW	Big-S&P EW	Big-S&P VW
Passive flows	<b>6.095</b> <b>(3.71)</b>	<b>6.101</b> <b>(3.04)</b>	<b>5.808</b> <b>(3.62)</b>	<b>5.822</b> <b>(2.89)</b>
S&P return			-0.0374 (-2.06)	-0.0203 (-0.89)
Lagged S&P return			-0.0104 (-0.57)	0.00773 (0.33)
VIX			0.000266 (1.24)	0.000358 (1.33)
Constant	-0.00470 (-2.74)	-0.00491 (-2.35)	-0.00868 (-1.72)	-0.0117 (-1.85)
Observations	99	99	99	99
R-squared	0.124	0.087	0.206	0.123

- Big = Top decile.
- Passive flows are associated with high contemporaneous return of large stocks relative to S&P500.

## Index Concentration

	$\Delta_{\text{top10}}$	$\Delta_{\text{stdev}}$	$\Delta_{\text{Herf}}$	$\Delta_{\text{top10}}$	$\Delta_{\text{stdev}}$	$\Delta_{\text{Herf}}$
Passive flows	<b>10.50</b> <b>(2.48)</b>	<b>9.484</b> <b>(2.42)</b>	<b>14.30</b> <b>(2.33)</b>	<b>10.08</b> <b>(2.41)</b>	<b>9.254</b> <b>(2.40)</b>	<b>13.95</b> <b>(2.30)</b>
S&P return				-0.0201 (-0.43)	0.000453 (0.01)	0.00508 (0.07)
Lagged S&P return				0.0184 (0.38)	0.0182 (0.41)	0.0322 (0.46)
VIX				0.00122 (2.17)	0.00130 (2.51)	0.00210 (2.58)
Constant	-0.000463 (-0.11)	8.74e-05 (0.02)	0.000503 (0.08)	-0.0250 (-1.90)	-0.0267 (-2.20)	-0.0430 (-2.25)
Observations	99	99	99	99	99	99
R-squared	0.060	0.057	0.053	0.121	0.126	0.125

- Passive flows are associated with increases in index concentration.

## Return Volatility

	Total vol	Total vol	Idio vol	Idio vol
Lagged passive flows	51.63 (6.12)	20.51 (15.94)	47.36 (4.96)	20.64 (13.58)
Log(weight)	-0.0635 (-12.04)		-0.0749 (-13.12)	
Log(weight) $\times$ Lagged passive flows	<b>4.135</b> <b>(3.41)</b>		<b>3.495</b> <b>(2.50)</b>	
Big		-0.0354 (-2.70)		-0.0471 (-3.28)
Big $\times$ Lagged passive flows		<b>21.66</b> <b>(4.87)</b>		<b>19.30</b> <b>(4.00)</b>
Lagged total vol	0.595 (93.97)	0.610 (104.07)		
Lagged idio vol			0.607 (84.85)	0.628 (98.91)
Observations	45737	45737	45737	45737
R-squared	0.571	0.569	0.613	0.609

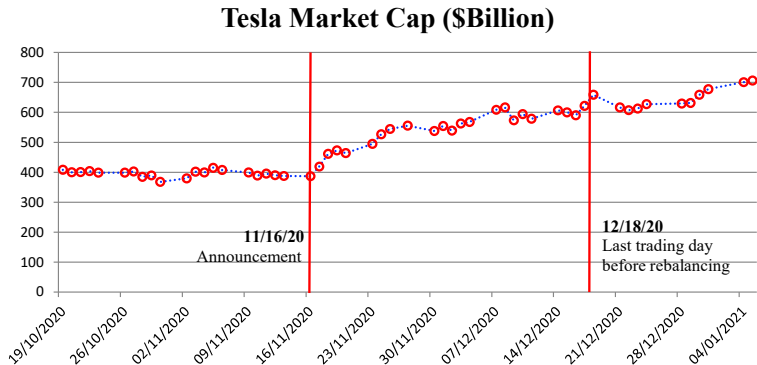
- Firm and quarter fixed effects. Control for S&P return.
- Passive flows raise more the volatility of large stocks.

## Index Additions

	Ann to Eff	Eff	Eff+1 to Eff+10
Weight	<b>27.92</b> <b>(7.28)</b>	<b>8.066</b> <b>(2.38)</b>	<b>-6.234</b> <b>(-2.62)</b>
Constant	0.0138 (2.84)	0.00388 (1.19)	-0.00610 (-1.74)
Observations	426	426	426
R-squared	0.094	0.024	0.009

- Index additions raise more the prices of large stocks.

## Case Study: Tesla



- Tesla's market capitalization rose by 50% in the month around its addition to the S&P500.

# Conclusion

- Passive investing is not neutral.
- Flows into passive funds tracking value-weighted indices:
  - Raise disproportionately prices of largest stocks within the indices.
  - Raise largest stocks' return volatility and price sensitivity to cashflow news.
  - If stocks are mispriced because of noise traders:
    - Prices of overvalued stocks within the indices' largest rise disproportionately.
    - Asymmetric effect: Aggregate market rises even when flows are a pure reallocation from active to passive.
  - Index additions raise more the prices of the largest and most overvalued stocks.
- Provide empirical evidence in support of model's predictions.