
Should Benchmark Indices Have Alpha? Revisiting Performance Evaluation

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How Would You Evaluate These Funds?

- Regress 3 stock portfolios on the four-factor Fama-French-Carhart model
- 26-year period from 1980 to 2005
- Portfolio A:
 - $b = 0.82\%$ ($t = 2.95$) per year
- Portfolio B:
 - $b = -2.41\%$ ($t = -3.35$) per year
- Portfolio C:
 - $b = 5.24\%$ ($t = 3.97$) per year

Even Passive Indices Appear to Have Skill

- All portfolios are entirely passive:
 - *A*: S&P 500
 - *B*: Russell 2000
 - *C*: S&P 500 Growth – Russell 2000 Growth
- Easily replicated by cheap index funds
- Most common US equity benchmarks
 - ... significant biases for performance evaluation?
- Together *A* and *B* cover 85% of US equity market
 - ... relevant for portfolios with size or size-value tilt

Implications for Active Trading Strategies

- Fama-French 2x3 size-value grid
- Active long-short portfolio
 - Long positions in Large Growth stocks
 - Short positions in Large Value
- 1980 to 2005:
 - Long side underperformed short side by 1.66% p/y
 - Carhart model: positive alpha of 3.90% p/y
 - Fama-French alpha is 4.33%
- Mechanical application may lead to incorrect inferences about performance

Research Questions

- 1) How large a problem are these index alphas?
 - Effect for all common indices
- 2) Why do we get non-zero index alphas?
 - Problems in factor construction
- 3) What would be a better factor model?
 - Modified factors and index-based factors

Main Results

- Benchmark 'alphas' for Fama-French-Carhart model
 - Large impact on performance evaluation
 - Especially across size-value grid
- Benchmark 'alphas' misleading
 - Primarily from FF factor construction
 - Also: CRSP market index construction and (Russell 2000) index reconstitution
- Alternative size and value factors based on benchmark indices
 - Improve estimation of fund alphas
 - Improve pricing

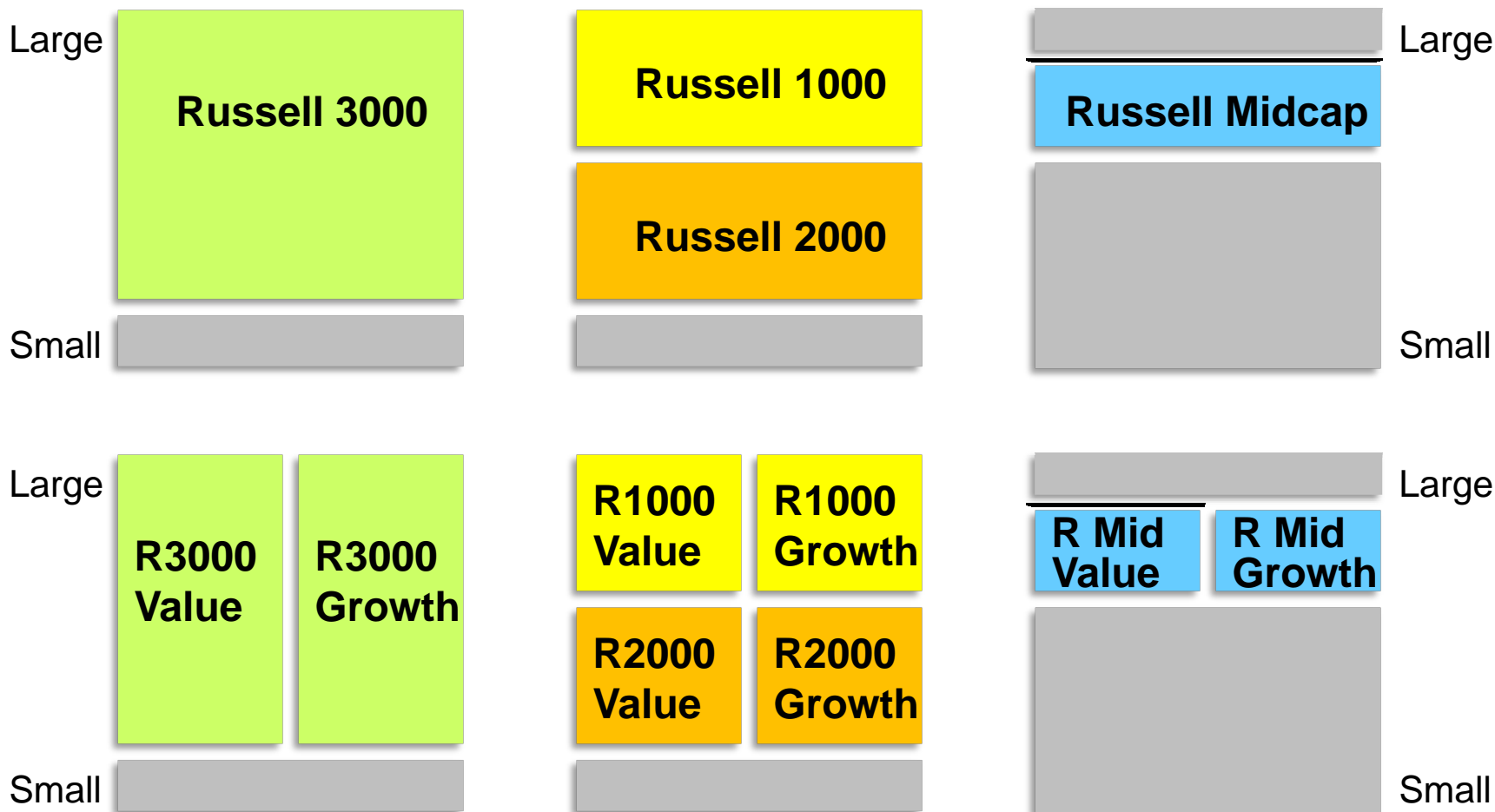
Data Sources

- Benchmark index returns
 - Monthly and daily returns directly from index providers: S&P, Russell, DJ Wilshire
- Benchmark index holdings
 - Monthly data directly from index providers
- Mutual fund returns
 - Monthly returns from CRSP
 - Daily returns from CRSP, Yale ICF, and S&P
- Mutual fund holdings
 - Quarterly/semiannually from Thomson Financial
 - Stock and firm data from CRSP and Compustat

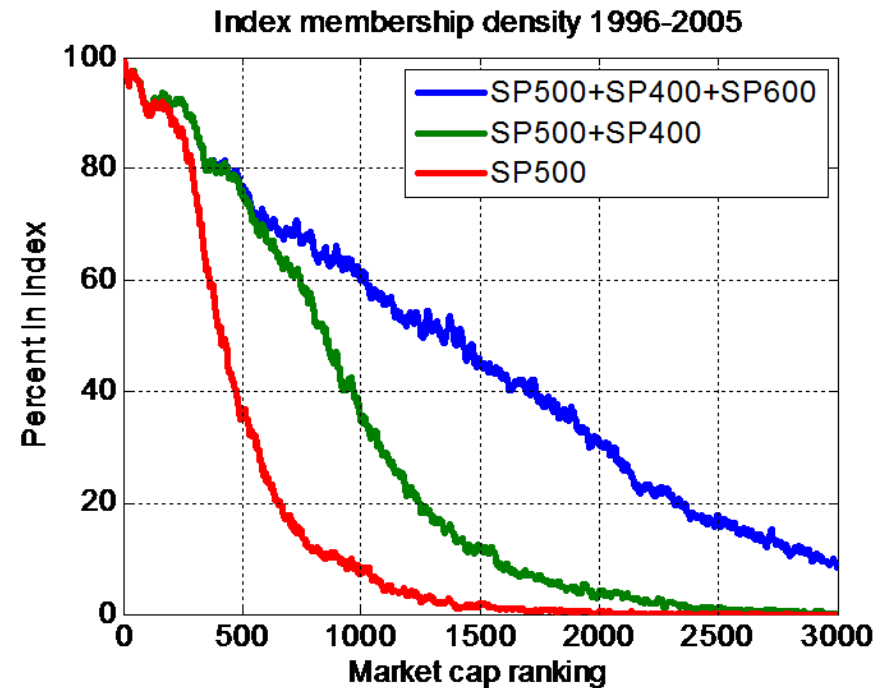
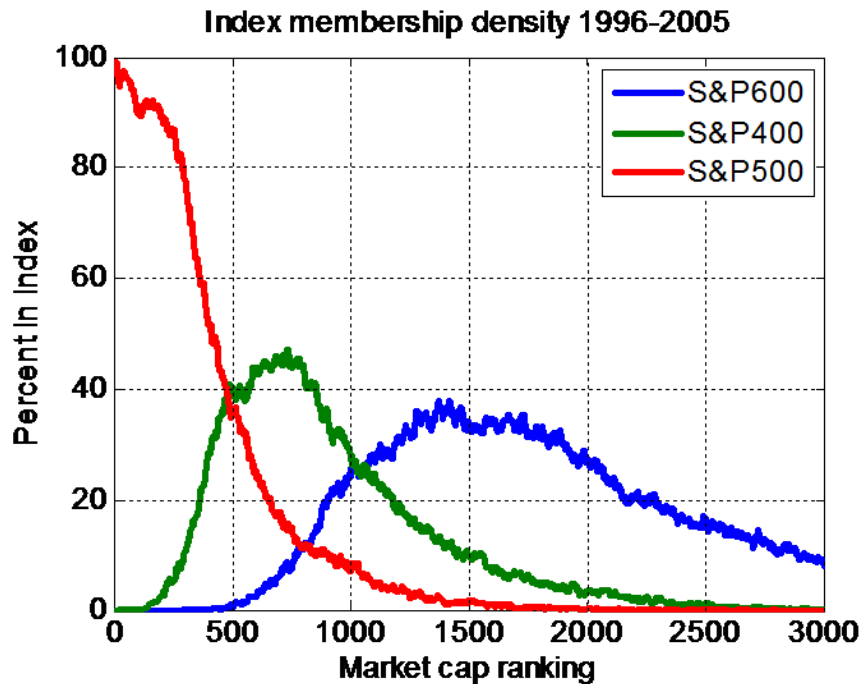
Benchmark Indices: S&P and Wilshire



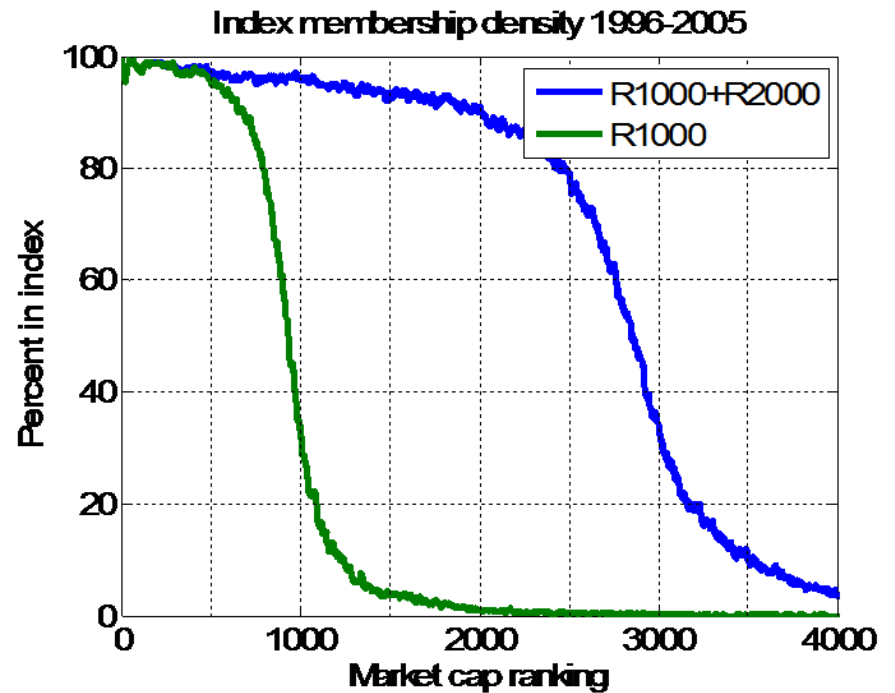
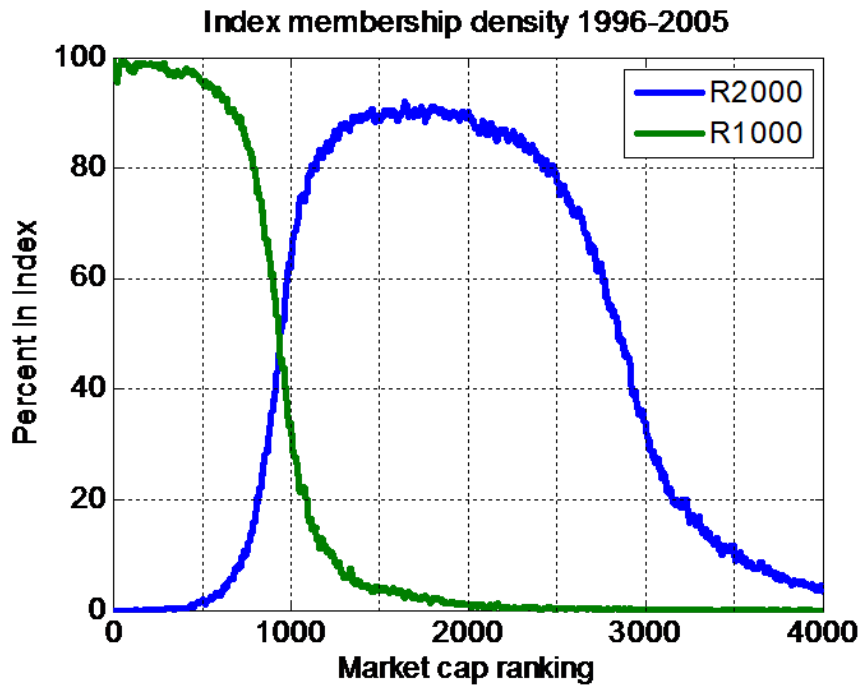
Benchmark Indices: Russell



S&P Indices Are a Subset of the Market



Russell Indices Include Entire Market



Fama-French-Carhart vs. Indices

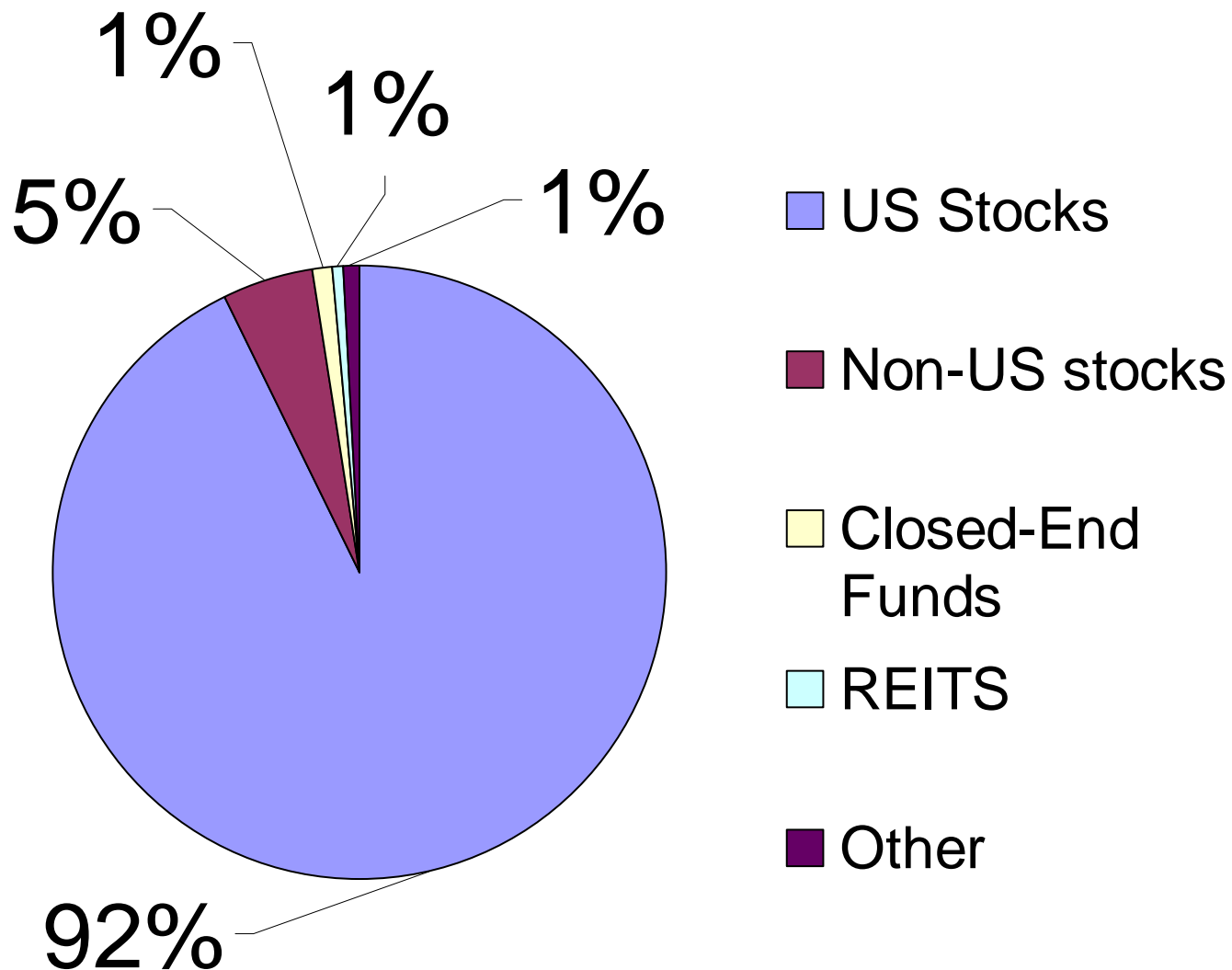
Benchmarks implied by FF-C model *versus* indices:

- CRSP-VW includes assets most indices/portfolios do not
- SMB is EW mix of growth and value
 - Indices are VW
 - Small value has outperformed \Rightarrow EW SMB $>$ VW SMB
- SMB excludes stocks with no/negative BtM (e.g., IPOs)
 - Including reduces SMB spread
- FF-C: same value effect for Big and Small stocks
- Boundaries differ
 - FF-C includes Midcaps in Big
 - Indices include both High and Med BtM stocks in Value

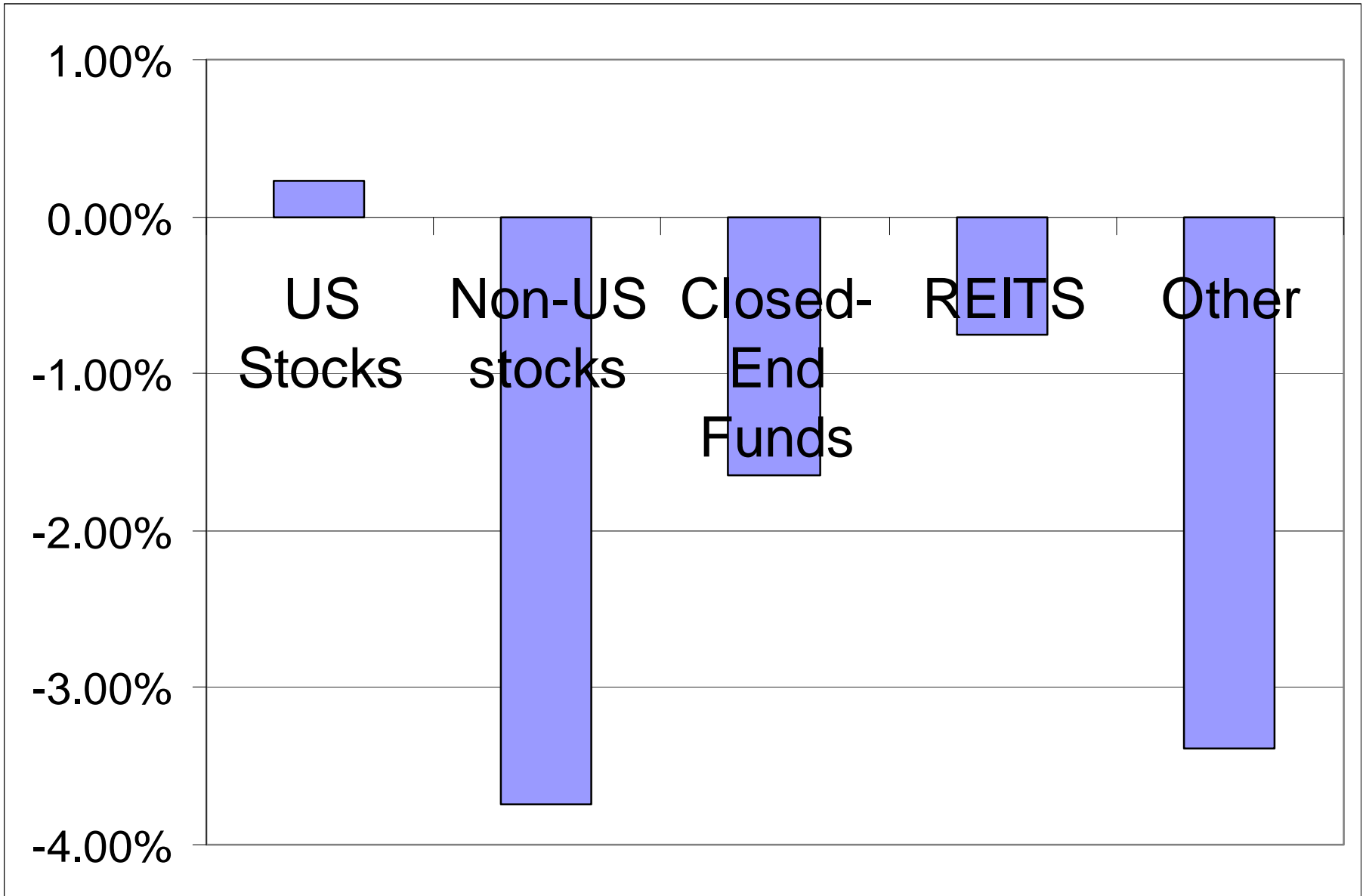
Index Alphas 1980-2005

| Main index | Style component | | |
|------------------|------------------|------------------|------------------|
| | Value | All | Growth |
| Russell 3000 | -0.55 (-1.01) | 0.18 (0.96) | 1.02 (2.05) |
| Russell 1000 | -0.45 (-0.83) | 0.47 (2.58) | 1.50 (2.73) |
| Russell Midcap | -0.52 (-0.54) | 0.17 (0.24) | 1.61 (1.34) |
| Russell 2000 | -1.25 (-1.31) | -2.41 (-3.35) | -3.41 (-3.87) |
| S&P 500 | -0.35 (-0.69) | 0.82 (2.95) | 1.82 (2.76) |
| S&P Midcap 400 | 0.84 (0.51) | 1.44 (1.33) | 0.64 (0.32) |
| S&P Smallcap 600 | -1.49 (-0.89) | -2.59 (-2.20) | -3.05 (-1.39) |
| Wilshire 5000 | | 0.05 (0.43) | |
| Wilshire 4500 | | -0.56 (-0.79) | |

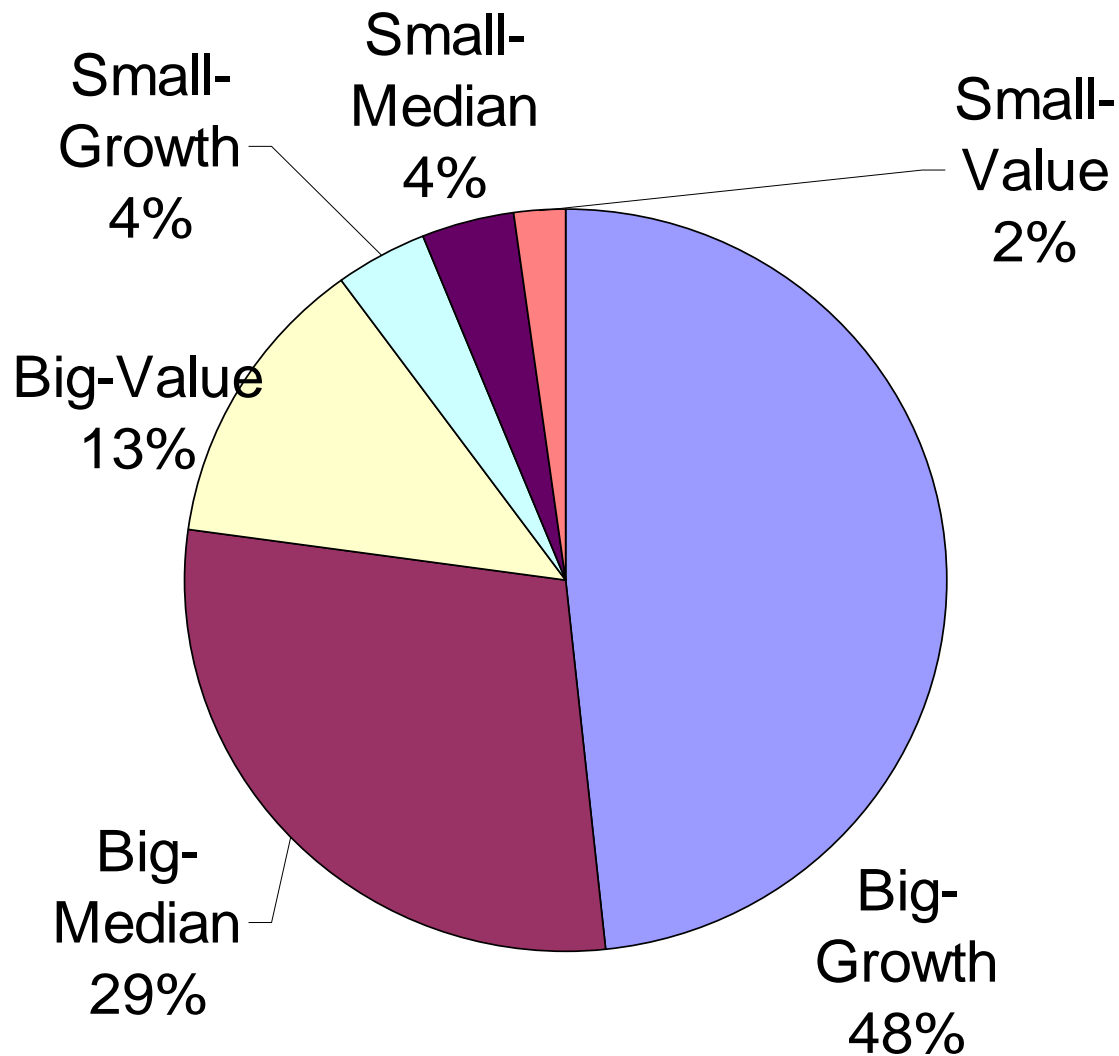
Choice of the Market Portfolio: Not just US Common Stocks in CRSP-VW



Choice of the Market Portfolio: FF-C Annualized Alphas for CRSP-VW Categories



Fama-French Component Portfolios: Market Weights



Fama-French Component Portfolios

| | MktRf weights | | | | |
|-------|---------------|------|------|------|-------|
| | None | Gro | Med | Val | All |
| Big | 7.8 | 42.6 | 25.5 | 11.1 | 86.9 |
| Small | 4.2 | 3.5 | 3.4 | 2.0 | 13.1 |
| All | 12.0 | 46.1 | 28.9 | 13.0 | 100.0 |

| | Average excess return per year | | | | |
|-------|--------------------------------|------|-------|-------|------|
| | None | Gro | Med | Val | All |
| Big | 5.92 | 7.61 | 8.62 | 9.20 | 7.72 |
| Small | 6.47 | 4.85 | 11.77 | 13.21 | 8.29 |
| All | 5.87 | 7.20 | 8.95 | 10.02 | 7.64 |

Weights of SMB and HML

SMB

| | None | Gro | Med | Val | All |
|-------|------|-------|-------|-------|--------|
| Big | 0.0 | -33.3 | -33.3 | -33.3 | -100.0 |
| Small | 0.0 | 33.3 | 33.3 | 33.3 | 100.0 |
| All | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 |

HML

| | None | Gro | Med | Val | All |
|-------|------|--------|-----|-------|-----|
| Big | 0.0 | -50.0 | 0.0 | 50.0 | 0.0 |
| Small | 0.0 | -50.0 | 0.0 | 50.0 | 0.0 |
| All | 0.0 | -100.0 | 0.0 | 100.0 | 0.0 |

Size Decile 10 vs. Its 3-Factor Benchmark

Target portfolio:
Size decile 10

| | None | Gro | Med | Val | All |
|-------|------|------|------|------|-------|
| Big | 0.0 | 60.0 | 29.2 | 10.8 | 100.0 |
| Small | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 |
| All | 0.0 | 60.0 | 29.2 | 10.8 | 100.0 |

Benchmark portfolio:

$0.967 \times \text{MktRf} - 0.318 \times \text{SMB} - 0.086 \times \text{HML}$

| | None | Gro | Med | Val | All |
|-------|------|------|------|-------|-------|
| Big | 7.5 | 56.1 | 35.2 | 17.0 | 115.8 |
| Small | 4.1 | -2.9 | -7.3 | -13.0 | -19.1 |
| All | 11.6 | 53.2 | 27.9 | 4.0 | 96.7 |

Size Decile 4 vs. Its 3-Factor Benchmark

Target portfolio:
Size decile 4

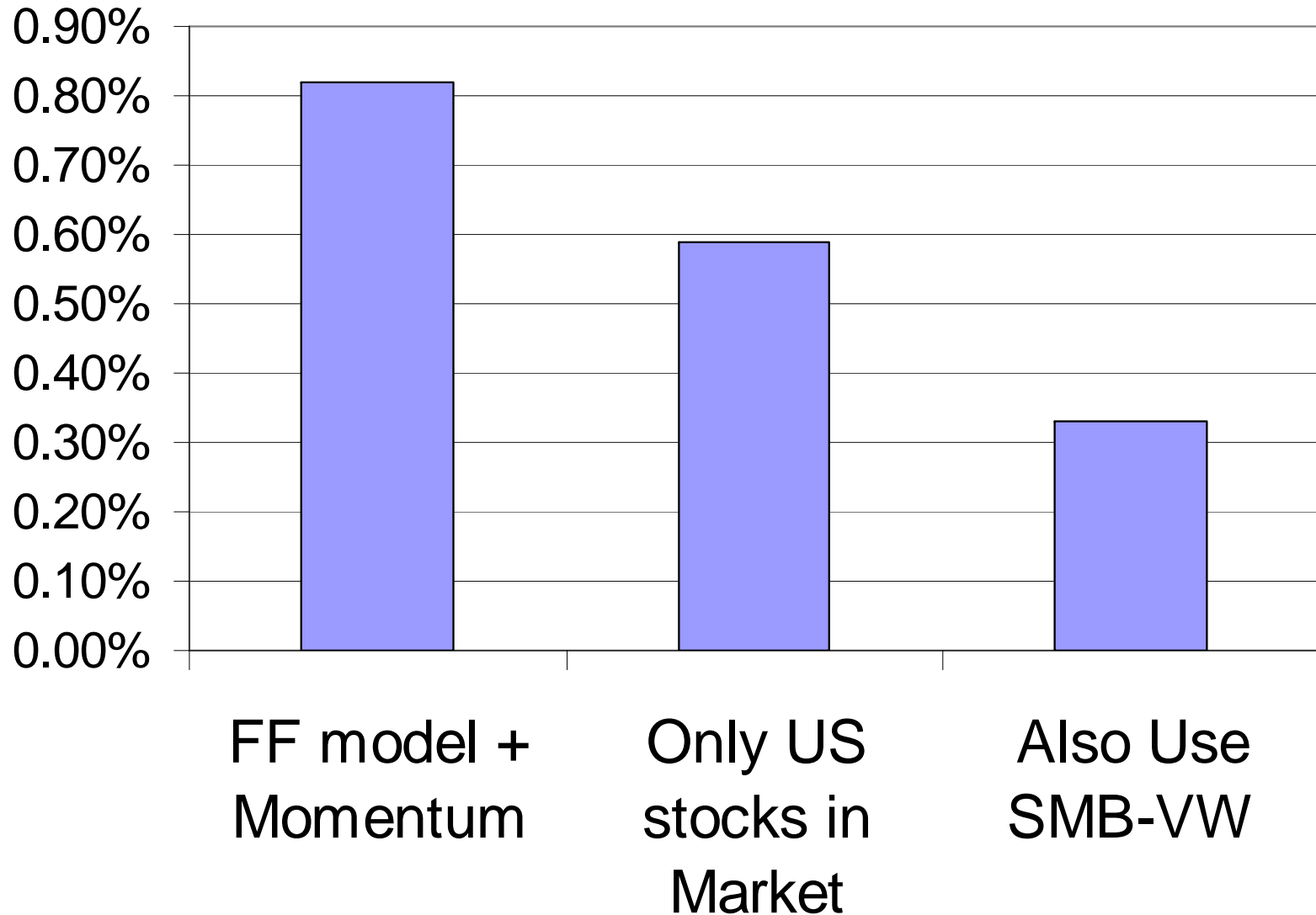
| | None | Gro | Med | Val | All |
|-------|------|------|------|------|-------|
| Big | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 |
| Small | 0.0 | 40.7 | 40.5 | 18.7 | 100.0 |
| All | 0.0 | 40.7 | 40.5 | 18.7 | 100.0 |

Benchmark portfolio:

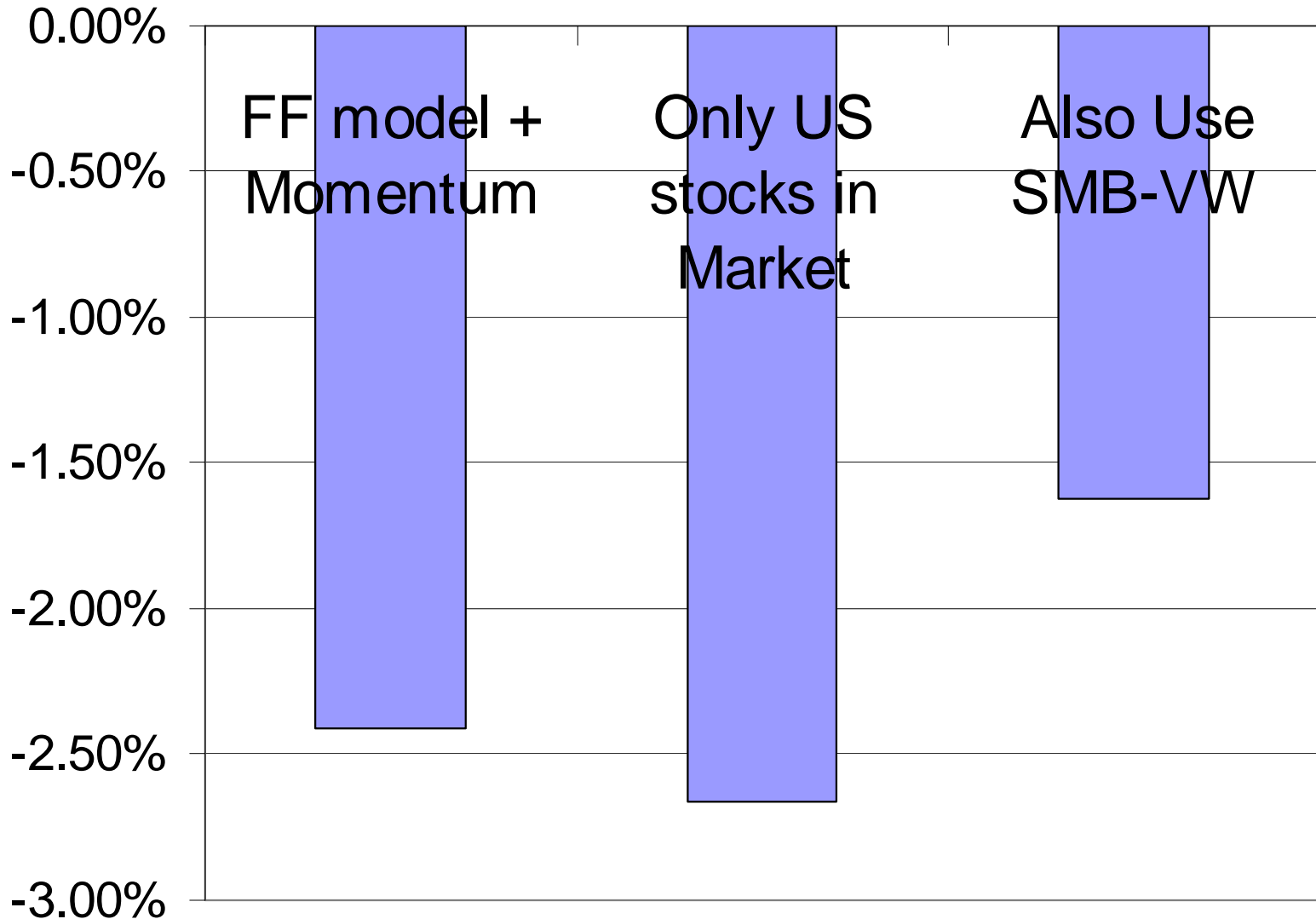
$$1.055 \times \text{MktRf} + 0.799 \times \text{SMB} + 0.226 \times \text{HML}$$

| | None | Gro | Med | Val | All |
|-------|------|------|------|------|-------|
| Big | 8.2 | 7.0 | 0.3 | -3.7 | 11.8 |
| Small | 4.5 | 19.1 | 30.2 | 40.0 | 93.8 |
| All | 12.7 | 26.1 | 30.5 | 36.3 | 105.5 |

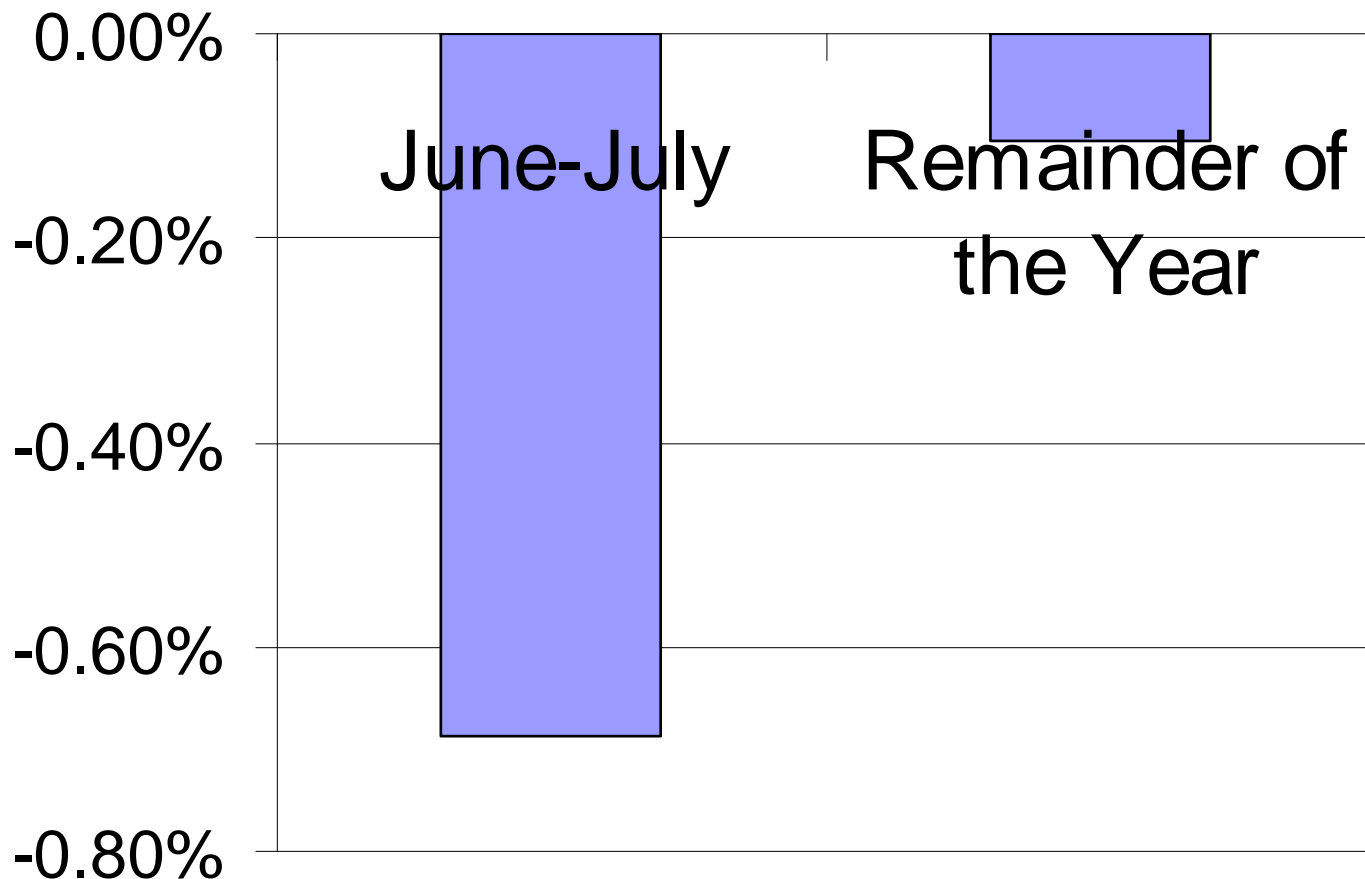
S&P 500 Alpha and Modified FF Factors: Annual Alpha



Russell 2000 Alpha and Modified FF Factors: Annual Alpha



Russell 2000 Reconstitution Effect: Annualized Alpha



- Index reconstitution costs (e.g., Petajisto (2008))

Criteria for a Good Model

- Pricing
 - Simplest possible explaining the cross-section of expected returns
- Benchmarking money managers
 - Most accurate estimate of a manager's value added relative to a passive strategy
- Benchmark model includes pricing model
 - Add non-priced factors
 - Reduce noise in alpha estimates

Selection of Alternative Models

- Carhart: MktRf, SMB, HML, UMD
- Carhart + S&P500 + Russell 2000
- Modified Carhart:
 - Only US stocks, value-weighted SMB and HML
 - Seven-factor model:
 - MktRf, MMB, SMM, BHML, MidHML, SHML, UMD
- Index-based models:
 - S5, R2-S5, R3V-R3G, UMD
 - S5, RM-S5, R2-RM, R3V-R3G
 - S5, RM-S5, R2-RM, S5V-S5G, RMV-RMG, R2V-R2G, UMD

Our Tests for Alternative Models

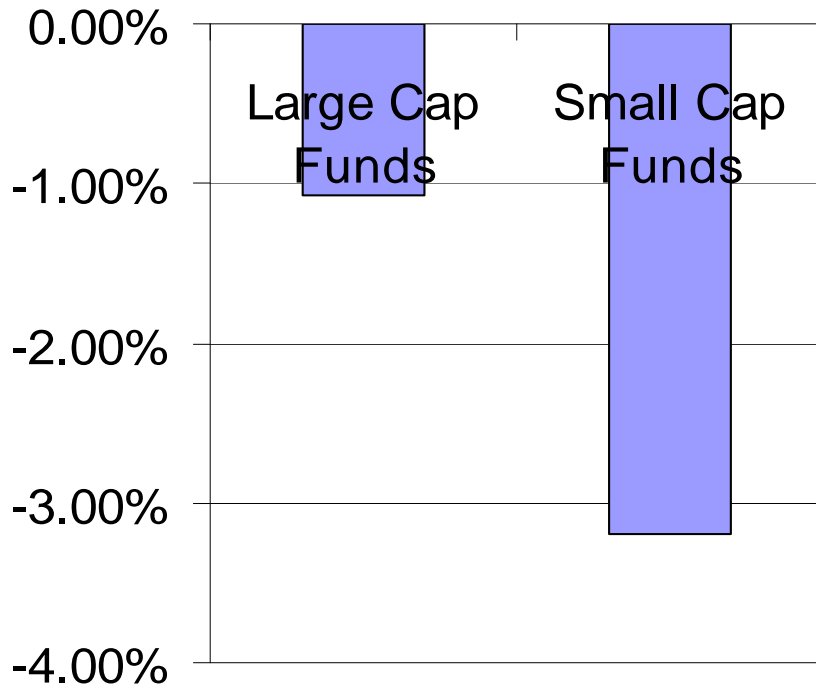
- Explain common time series variation
 - Tracking error volatility of all-equity mutual funds
- Explain cross-section of average returns
 - Mutual funds
 - 3 x 3 portfolio sort by size and value
 - 100 Fama-French size-value portfolios
 - 10 x 10 portfolio sort by size and value

Index-Based Models Perform the Best

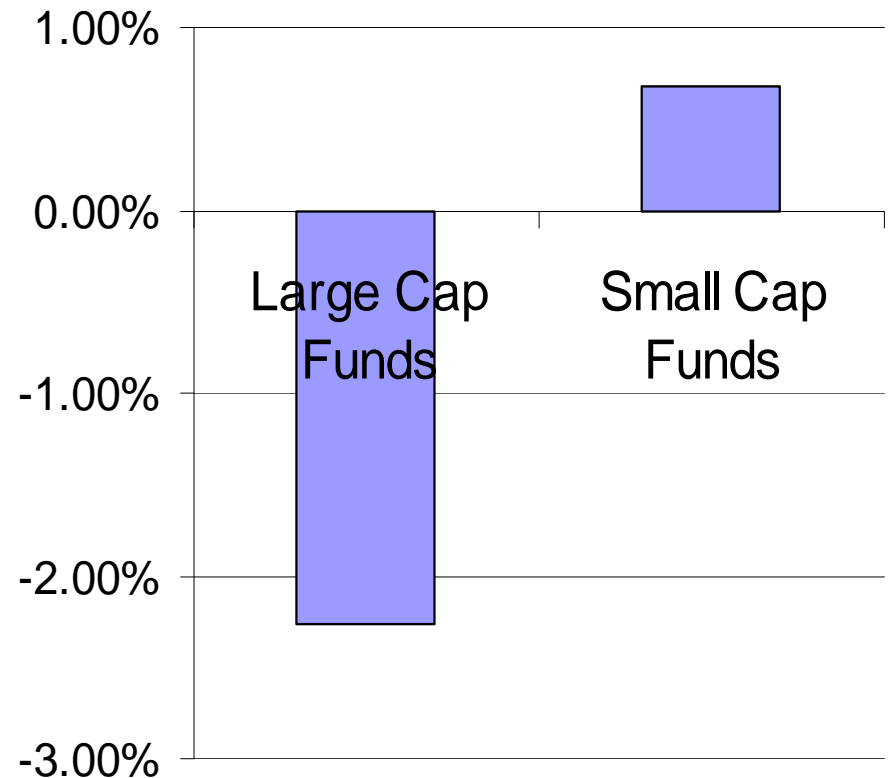
- Out-of-sample Tracking Error of mutual funds
 - Index models: lowest TE (5% - 10% lower)
- Cross-section of average mutual fund returns:
 - Index models
 - close-to-zero alphas across all fund groups
 - Carhart model
 - small-cap funds underperform large-caps;
 - conclusion fully reversed (by 5% per year!) if control for benchmark index
- Cross-section of average return on 100 FF portfolios
 - Index models produce the highest R^2

Mutual Fund Alphas: Fama-French factors

FFC Annualized Alpha of Fund Return

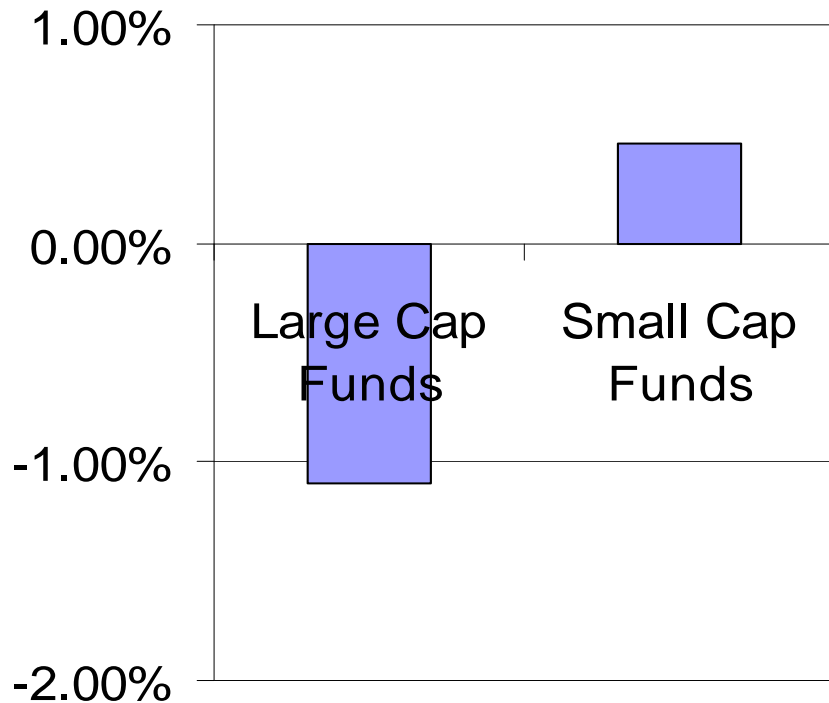


FFC Alpha, Benchmark-adjusted Fund Return

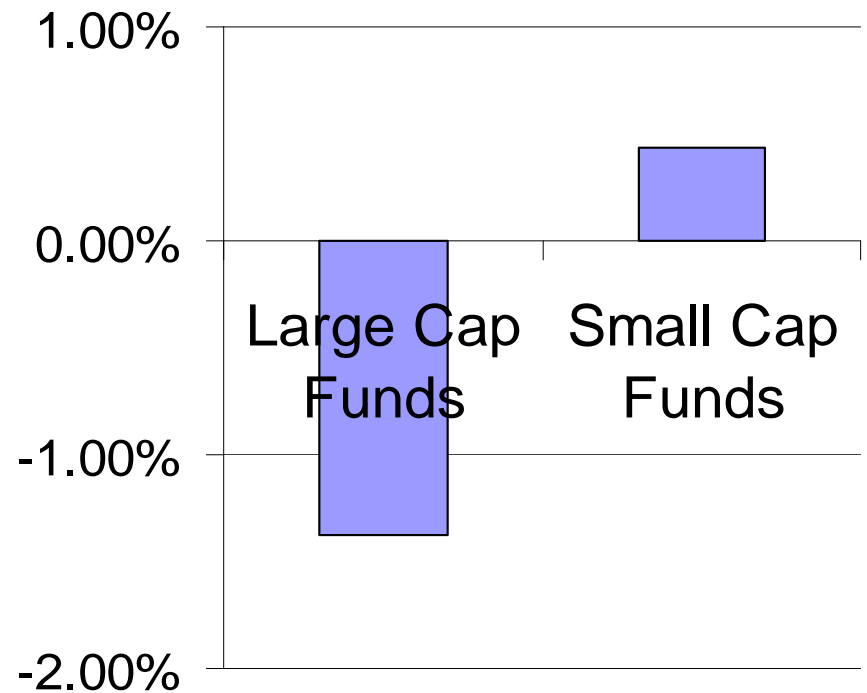


Mutual Fund Alphas: Index factors

4-factor Index Model
Annualized Alpha,
Fund Return

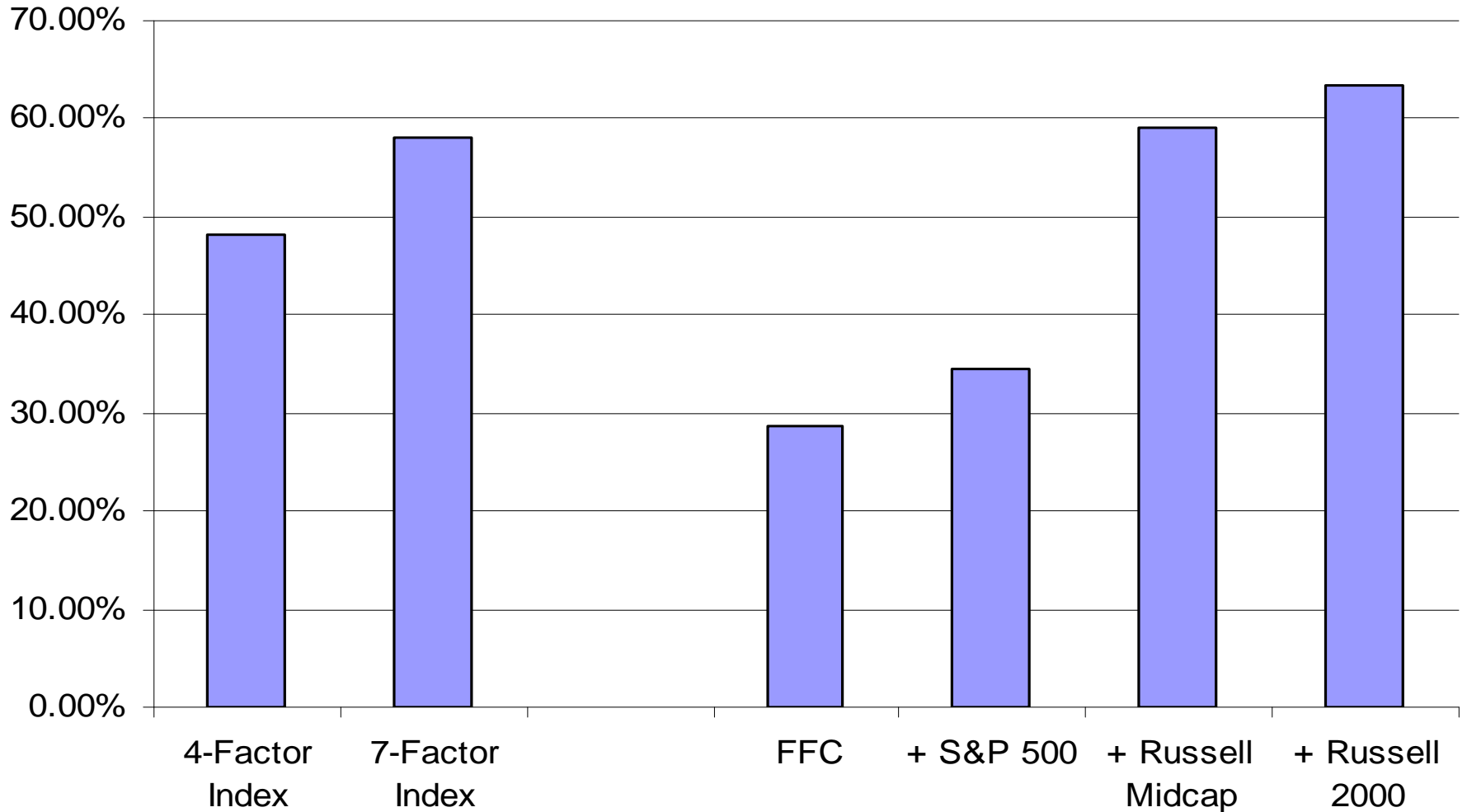


4-factor Index Model
Annualized Alpha,
Benchmark-adjusted Fund
Return



Cross-Section of 100 Fama-French Portfolios

R2 of Mean Returns on Betas



So What Model Do We Propose?

3 approaches:

1) Modify the Fama-French factors

- Value-weight SMB, only US stocks, etc.

2) Use benchmark-adjusted returns

- FF factors relatively harmless

3) Use index-based models

- 7 factors: S5, RM-S5, R2-RM, S5V-S5G, RMV-RMG, R2V-R2G, UMD
- 4 factors: S5, R2-S5, R3V-R3G, UMD, or
S5, RM-S5, R2-RM, R3V-R3G
- Simplest and most general approach

Further Considerations for Portfolio Performance Evaluation

Use benchmark factors that

- ... include similar assets as portfolio
 - E.g., both only US common stocks
- ... are representative of the portfolio asset class(es)
 - E.g., separate index for each asset class
- ... use similar weights
 - E.g., value-weighted
 - E.g., similar weights to value and growth, liquid and illiquid, traded and non-traded, high and low transaction costs, etc.

Conclusions

- Common indices
 - Large nonzero Fama-French alphas
 - Affects performance evaluation
- Benchmark FFC alphas are misleading
 - FF factor construction methodology
 - CRSP market and Russell 2000 reconstitution
- Alternative models based on benchmark indices
 - Improve estimation of alphas
 - Improve cross-sectional pricing