

In Pursuit of Trend-Following Beta: The Promise and Pitfalls of Replication

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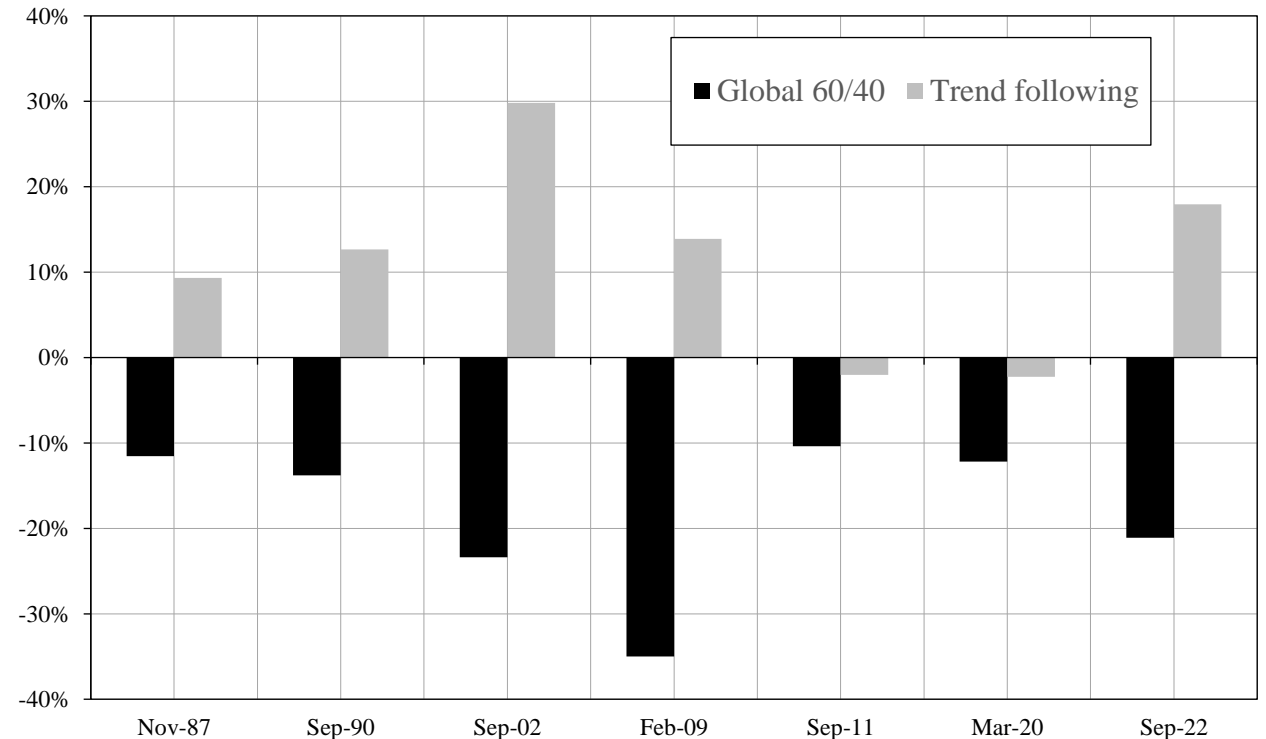
The message in a nutshell

- Trend-following is a nice asset class, but problematic to access due to manager/model risk which is so large that can overwhelm the benefits of allocation
- Model/manager risk can be mitigated through replication of a broad index of TF funds, however...
- Replication introduces its own model risk and gives rise to a trade-off between skill leakage (-) and fee savings (+)
- Replication shortfalls can be addressed through regularization which helps in making TF replication attractive as an active strategy that seeks to generate alpha through fee savings

The case for trend-following

- Strategy monetizes trends through long/short positions in futures markets
- Relatively large capacity ~\$360bn AuM (3x Equity Long-Short HF)
- Historically low correlation to both stocks and bonds
- Positive skeweness → „crisis alpha”

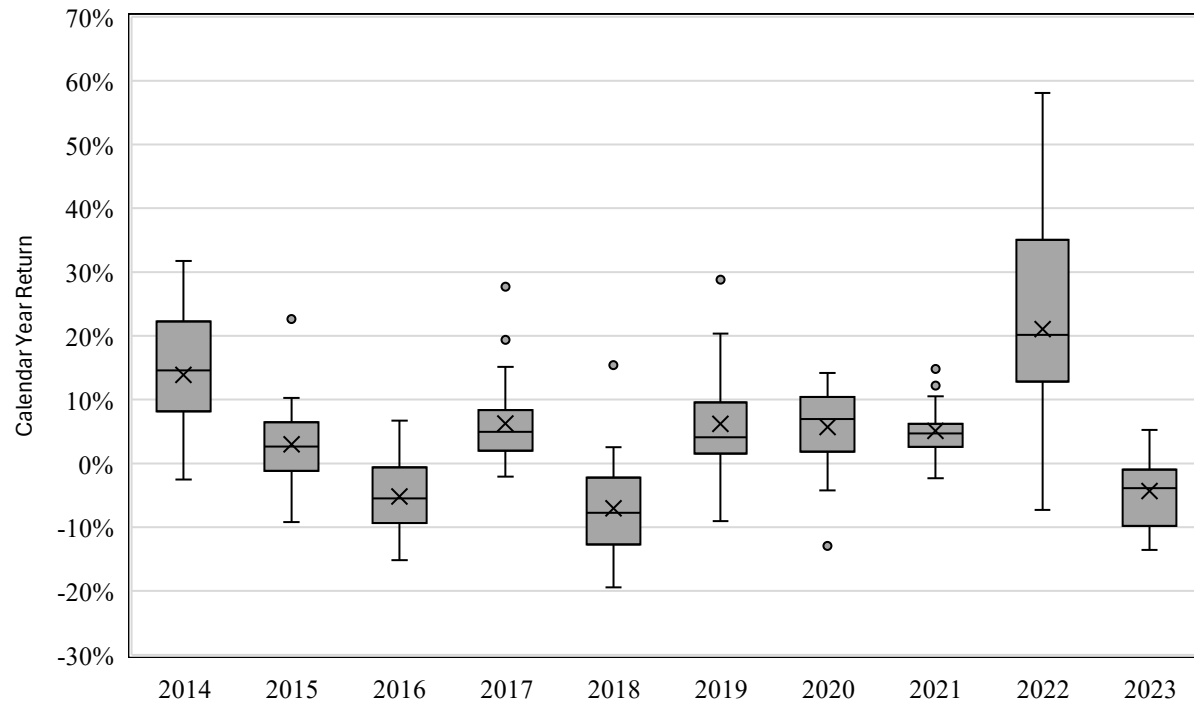
Performance of Trend-Following During Market Drawdowns



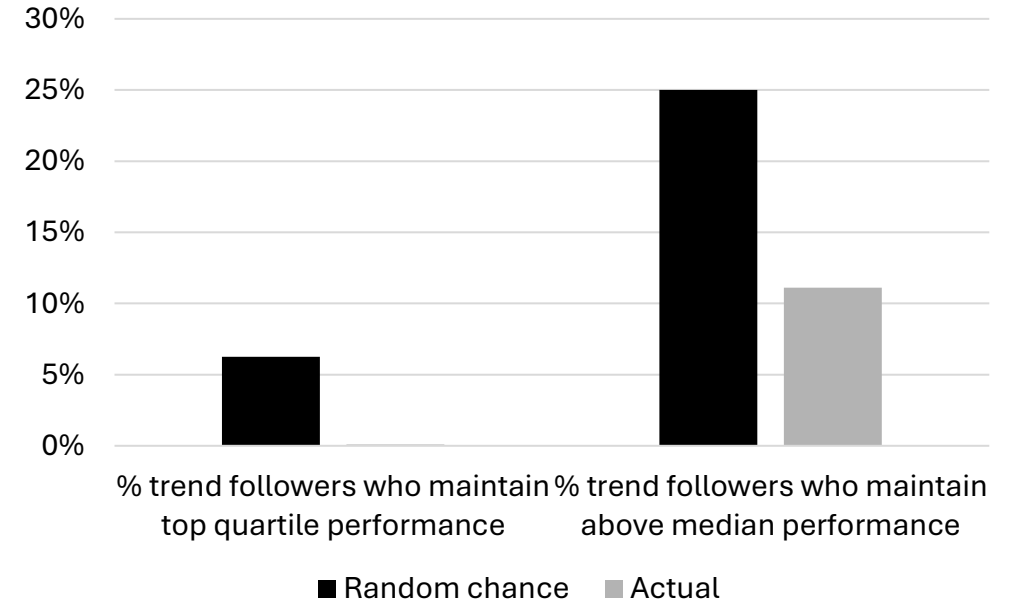
The problem with trend-following: manager/model risk

- Benefits of allocating to TF strategies typically demonstrated using one of the broad industry indices (BTOP50, SocGen Trend)
- Gaining exposure requires either developing a strategy oneself or delegating it to an external manager → in both cases actual performance will differ markedly from the index

Dispersion of Trend-Following Funds' Returns (2014 - 2023)

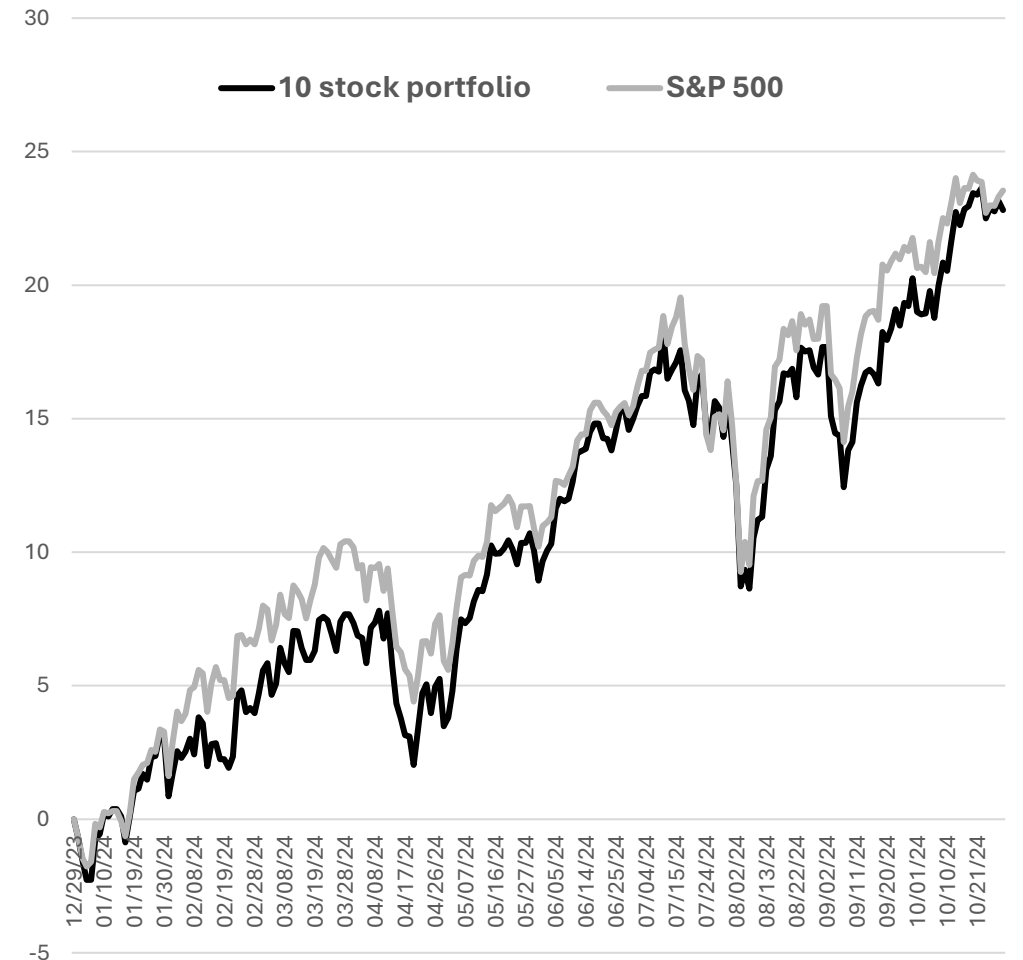


Performance persistence (2014-2018 vs. 2019-2023)



The case for replication

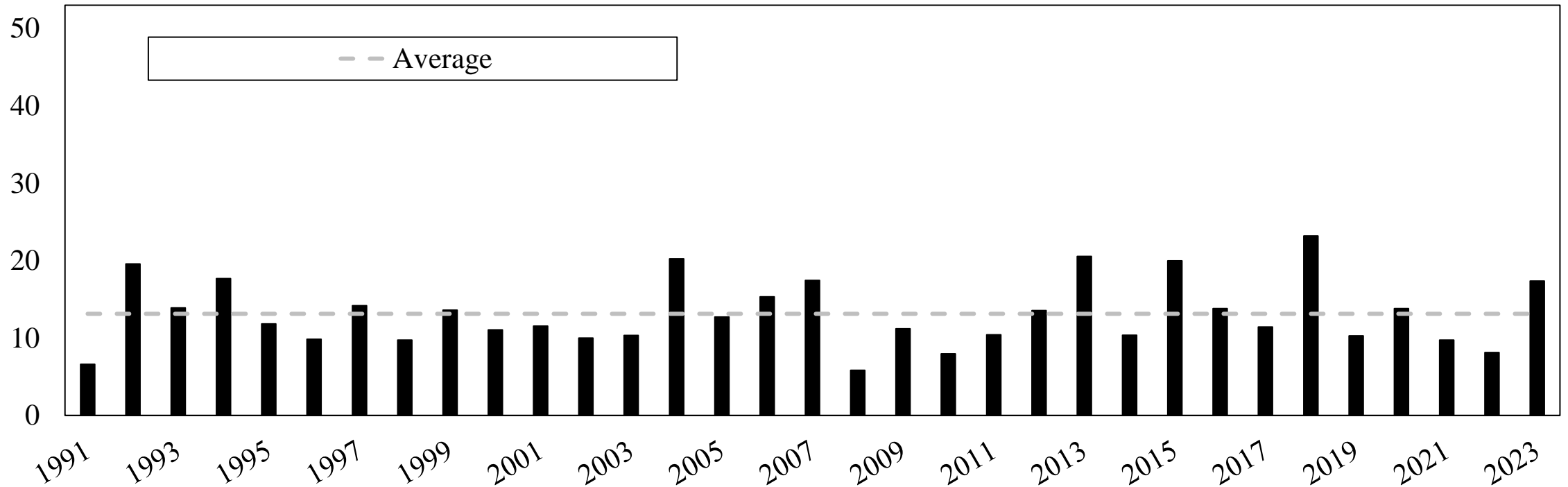
- Replication – find a basket of securities/factors that closely match the performance of a target index
- Works well for equity indices...
- If we could deploy it for TF index, could diversify model **and** manager risk
- But is replication of TF funds even feasible given large heterogeneity of trend models?



How many factors explain TF performance?

- Generate 50 TF strategies („managers”)
 - Same trend signal: $s_T = 2N \left(\sqrt{T} \frac{\bar{r}_T}{\sigma_T} \right) - 1 \in [-1,1]$
 - 12 different lookbacks $T=20, 40, \dots, 240$ days
 - Random universe selection (15-53 futures markets)
 - Risk parity weights, rebalanced daily
 - Random portfolio vol target 10-15%
 - TX costs modeled as in Hurst et. al (2017)
 - HF-style 2&20 fees
 - Sample runs 1991-2013
- Create Virtual Fund of Funds (VFOF) as equally weighted allocation to the 50 generic strategies
- Attribute VFOF performance to independent risk factors via PCA

Effective number of independent VFOF risk factors (1991-2023)

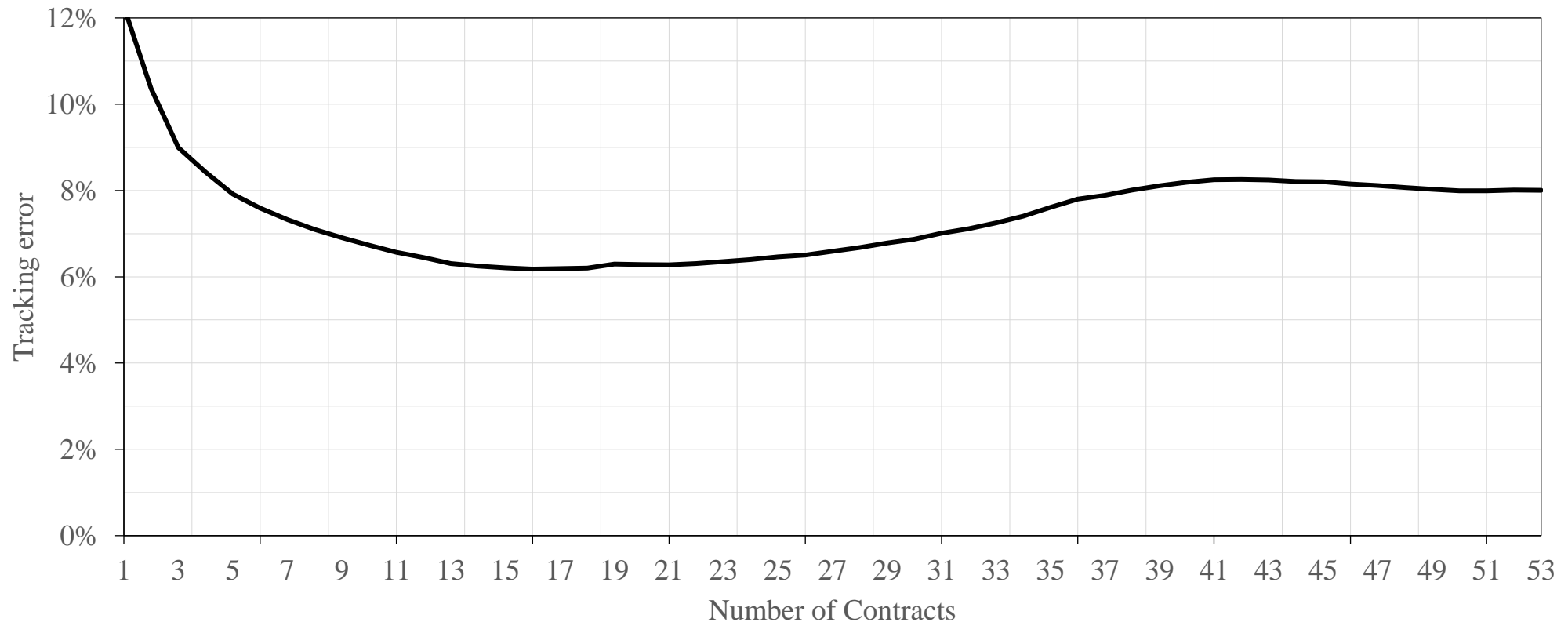


Effective number of factors = exponential of the Shannon entropy of the normalized absolute factor return contributions

Bottom line: replication of VFOF returns using a handful of contracts *should* be possible

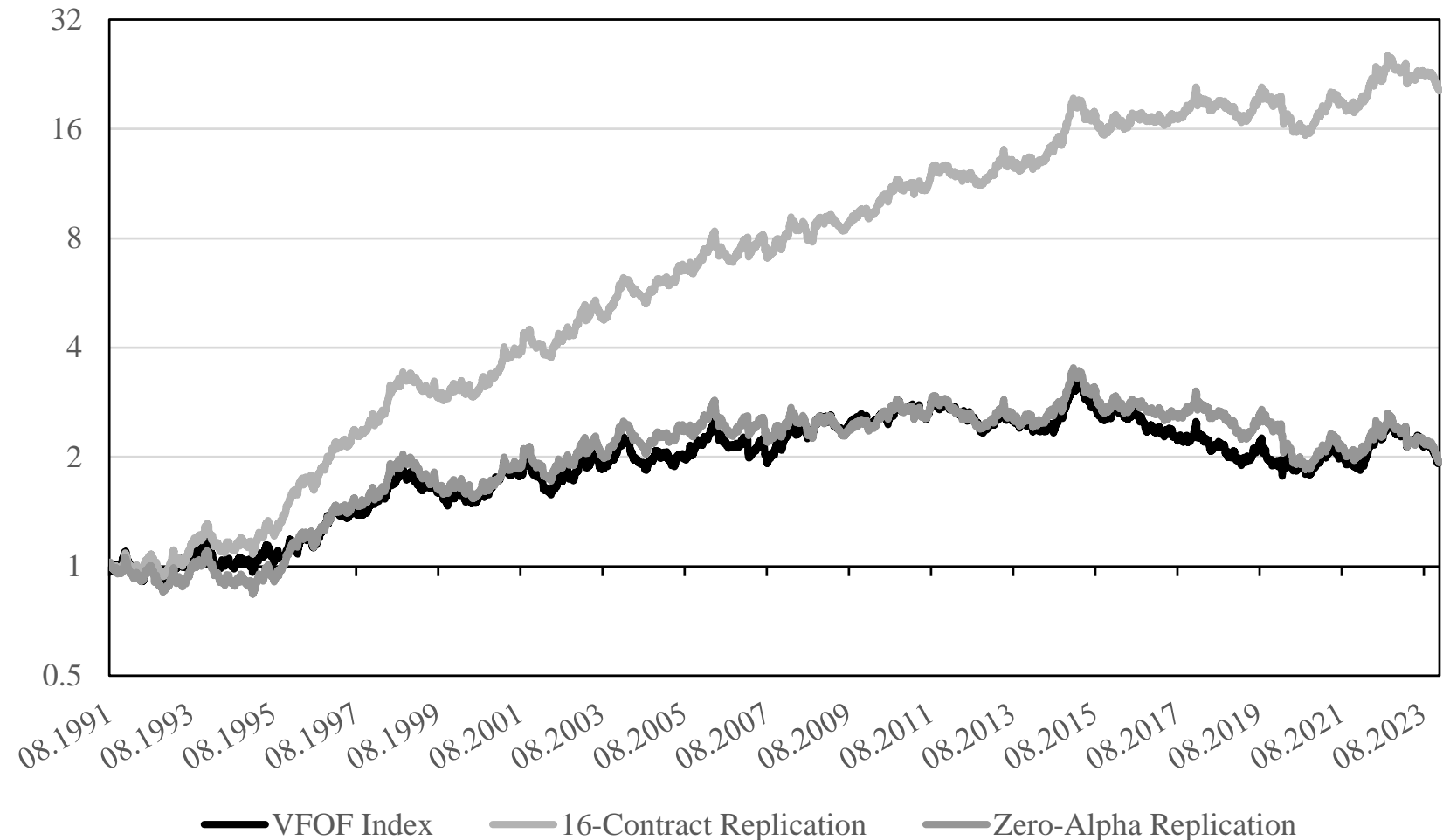
VFOF replication: best-case scenario

- OLS top-down approach
- Leave-one-out algorithm: starting from the full set of contracts (n=53), test removing one contract at a time discarding the worst performing futures (i.e. one whose removal leads to the lowest tracking error deterioration)



Replication introduces its own model risk, but offers the promise of „fee alpha”

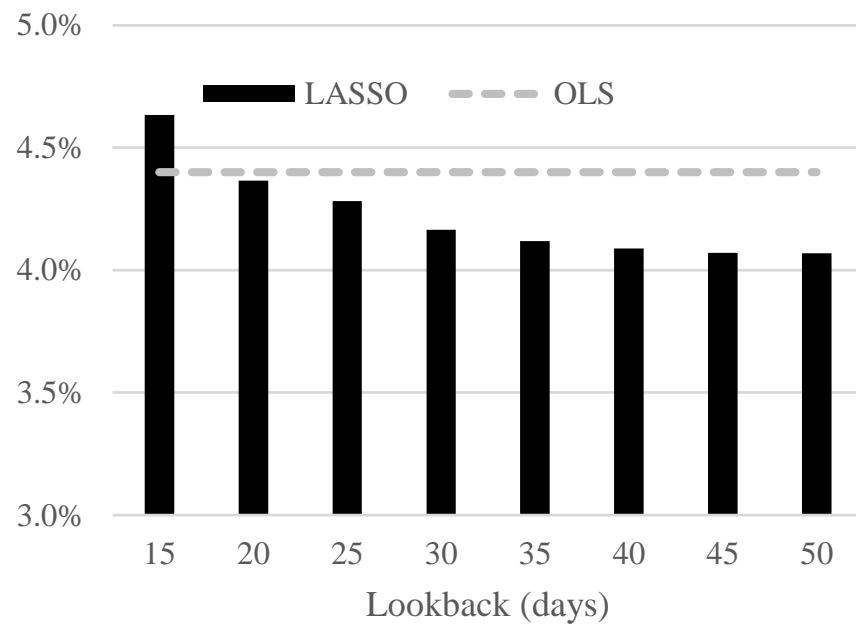
- VFOF in-sample costs:
 - 200 bps manager fees
 - 110bps performance fees
 - 275bps unnetted transaction costs
- Replication TE ~ 600 bps
- Replication ex ante IR ~ 0.9
- In-sample alpha ~ 700 bp
- **But this is a best case scenario**



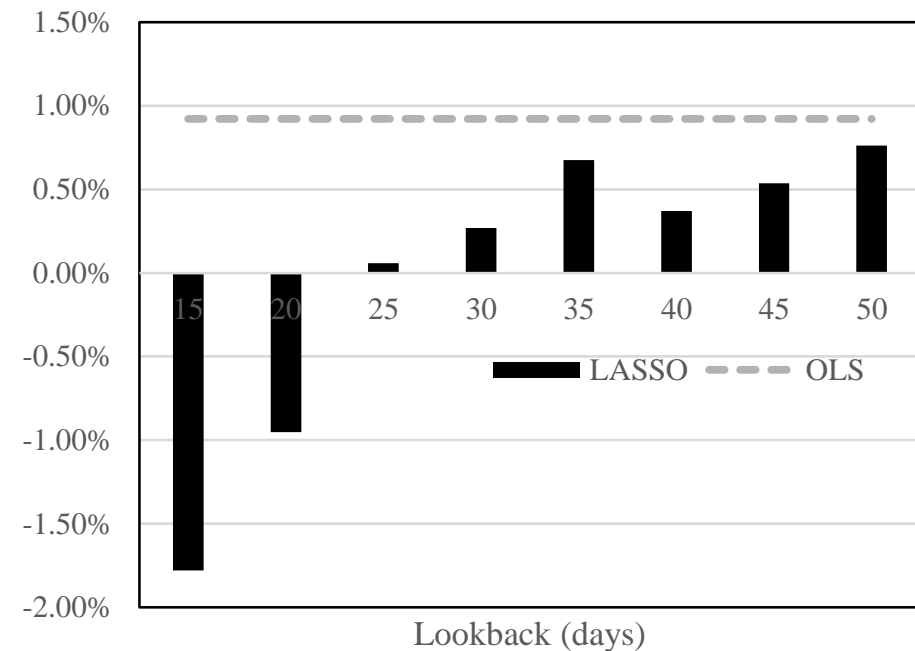
Replication of live managers: fee alpha vs. skill leakage trade-off

- OLS with a fixed 15-contract universe
- LASSO with 5-fold cross-validation (performed separately for each rolling window)

Replication Tracking Errors



Replication Excess Returns

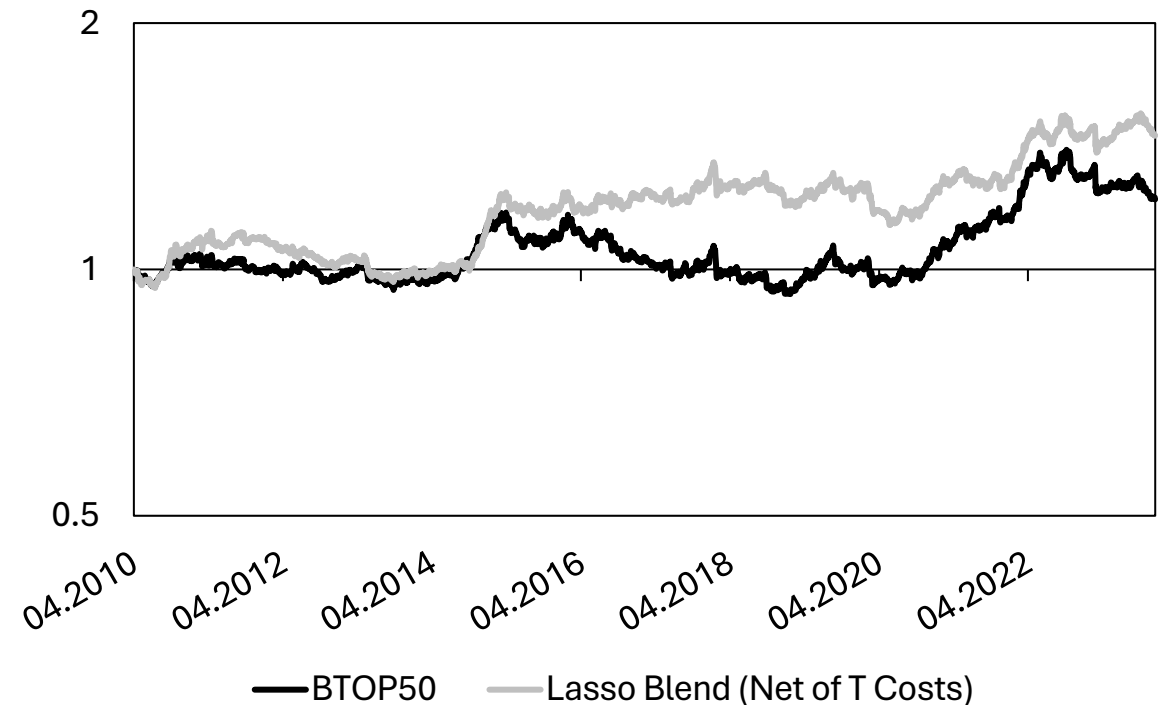
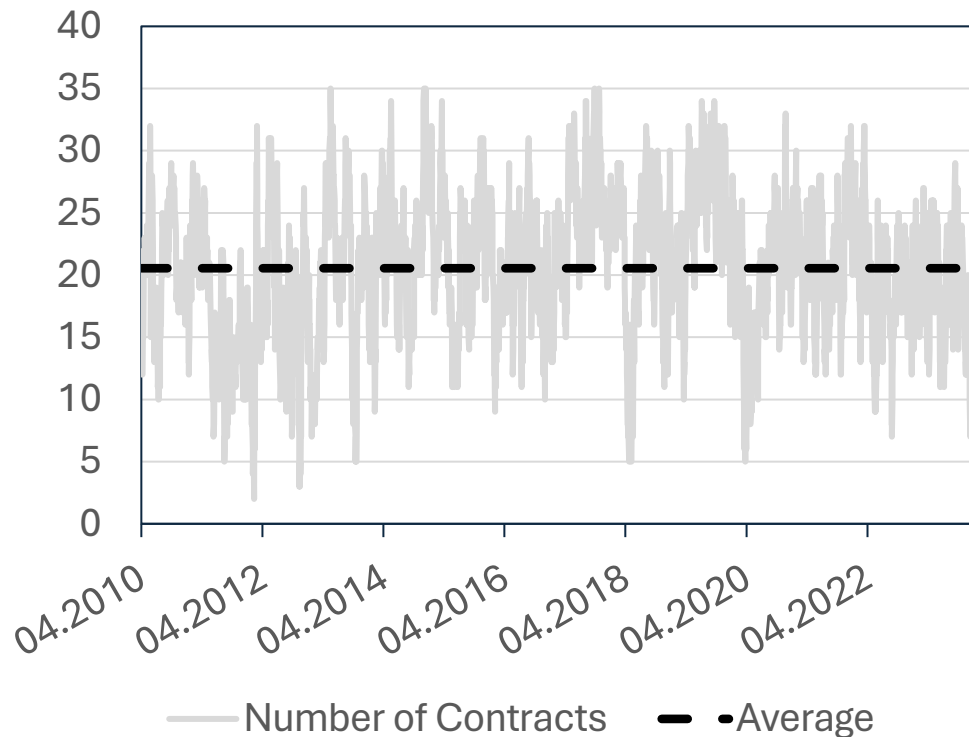


LASSO trades more mkts, and captures more skill but suffers higher tx costs

Replication improvements: 30-50 model blend

- Ability to capture trends of various length
- Reduce noise via model averaging
- Cut costs through trade netting

- Lower TE (<400bp)
- Higher excess return (133 bp)
- Superior IR ~ 0.34



Concluding message

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