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Conflicts of Interest among Affiliated Financial Advisors in 401(k) Plans: Implications for Plan Participants

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Abstract

Certain institutional features of 401(k) plans can create conflicts of interest between plan participants and financial advisors that advise them. We study one such conflict: when advisors are affiliated with the plan's recordkeeper. Using a large dataset of 401(k) plans, we find that affiliated advisors reduce investment performance of participants by steering their flows to proprietary funds. We observe no similar effects for unaffiliated advisors. Furthermore, affiliated advisors do not significantly improve participation rates, lower administrative fees, or increase diversification. Given the increasing prevalence of advisors within 401(k) plans, our findings have relevant implications for households, plan sponsors, and policymakers.

Keywords: 401(k) plans, financial advisors, conflicts of interest, recordkeepers.

JEL classification: G10, G11, J32.

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1 Introduction

American households increasingly rely on employer-sponsored retirement plans, such as 401(k) plans, to save for retirement. This has created both a growing demand for, and greater availability of, investment advice within these plans. Regulators and consumer advocacy groups, however, have raised the alarm that conflicts of interest may undermine the quality of advice provided to plan participants. As a result, the Department of Labor (DOL) attempted to resolve these issues through its 2016 and 2024 rulings, intended to broaden the definition of fiduciary advice to ensure that financial advisors act in the best interest of plan participants. Some consumer advocacy groups have supported the DOL's position, warning about the risks of conflicted advice and its potential harm to households' retirement security (Bradford 2017 and Huang 2024). Yet, surprisingly, we know little about the impact of conflicted financial advice on 401(k) plan participants.

A key reason for this limited understanding is that identifying where and how such conflicts arise within 401(k) plans is challenging. We identify one particular category of conflicted advice using a large cross-section of 401(k) plans and measure its impact on plan participants. Specifically, we examine conflicts that emerge when financial advisors are affiliated with the plans' recordkeepers, firms that help employers administer their 401(k) programs and can themselves face conflicts of interest (Pool, Sialm, and Stefanescu 2016, 2022). When advisors are affiliated with recordkeepers, this can create a conflict whereby advisors provide biased advice to participants, advancing the recordkeeper's (and consequently the advisor's) interests at the expense of plan participants.

To examine whether affiliated advisors' conduct is consistent with such a conflict of interest, we employ micro data on the 401(k) plans' investment options, such as mutual funds, along with their characteristics, performance, and flows from plans' participants. We also

¹ Increased demand for financial advice is evidenced in a 2024 survey conducted by Charles Schwab, while increased availability of financial advice in 401(k) plans is supported by evidence from annual surveys organized by Plan Sponsor Council of America. A more detailed discussion of these trends is provided in the next section.

employ information about whether advisors are available to plan participants, and the affiliation networks between advisors and recordkeepers. Crucially, a portion of the necessary data can be collected from Form 5500, which firms are required to file with the Department of Labor under the Employee Retirement Income Security Act (ERISA) regulations to protect employees' benefits. BrightScope Beacon digitizes the Form 5500 data, which enables us to link plan investment options to traditional mutual fund data, as well as to identify plans' recordkeepers, the presence of an advisor, and the relationships between advisors and recordkeepers.

Conflicted advice in our setting arises in a particular way. Many recordkeepers offer proprietary mutual funds, which they include in the investment menus of the 401(k) plans they service. Because recordkeepers earn fee revenue from their own funds, they have an incentive to steer participants into these proprietary offerings (Pool et al. 2016). Affiliated advisors can help the recordkeeper achieve this objective by recommending that plan participants invest in the recordkeeper's funds. Since proprietary funds are often inferior to other menu options (Pool et al. 2016), such advice can undermine participants' performance outcomes.

We find that the performance of plan participants deteriorates when a plan changes from having no advisor to adding an advisor that is affiliated with the recordkeeper. For each plan and year, we measure performance of plan participants using allocation-weighted plan alpha (which we call allocation alpha), defined as the average alpha of all funds in the plan's investment menu weighted by participants' actual aggregate allocations at the beginning of the year. Relative to plans without advisors, allocation alpha declines by 21 basis points in the first year after the introduction of an affiliated advisor and by 33 basis points per year in subsequent years, compared to the pre-introduction period. In contrast, we find no effect on performance when plans add advisors who are unaffiliated with the recordkeeper. This evidence suggests that the negative impact of affiliated advisors comes from their affiliation with recordkeepers and the conflicts of interest it introduces, rather than their role as advisors.

Moreover, our findings are not explained by heterogeneity in a variety of plan and recordkeeper characteristics.

Our baseline results provide initial evidence on the relation between affiliated advisors and performance of plan participants. However, as with many studies that examine the impact of financial advice on the decisions of advice recipients, we need to compare the actual aggregate performance of plan participants against a counterfactual, i.e., aggregate performance that would have resulted if the advisor had not been present. Without directly observing this counterfactual, it is difficult to establish whether observed performance changes are truly caused by the advisor's presence or by other unobserved factors. To overcome this challenge, we follow Chalmers and Reuter (2020) and use target date funds (TDFs) within plans to construct counterfactual comparison portfolios. We do so because Chalmers and Reuter (2020) show that individuals use target date funds as substitutes for brokers' fund recommendations within a retirement plan. Thus, we use the returns of target date funds within a plan to capture the counterfactual performance that participants would have realized if an advisor was not present. The difference between allocation alpha and the alpha of the counterfactual portfolio is our key measure, which we refer to as counterfactualadjusted alpha. We document that the introduction of affiliated advisors is associated with lower counterfactual-adjusted alpha. This effect is robust to controlling for myriad known determinants of investment decisions and portfolio outcomes and to how the counterfactual portfolio is constructed (whether the underlying target date funds are value-weighted or equally-weighted when constructing the counterfactual portfolio). Similar to our baseline results, the introduction of unaffiliated advisors has no effect on counterfactual-adjusted alpha.

We tackle endogeneity concerns using multiple approaches. First, most of our tests exploit the staggered introductions of advisors across plans and implement a difference-in-differences design. Importantly, we document that trends in the outcome variable were the same for both treated and control groups prior to the treatment, which supports the validity of our identification strategy.

Second, we conduct instrumental variable (IV) regressions, whereby we instrument for the presence of an affiliated advisor in a given plan and year serviced by a given recordkeeper using the total proportion of plans serviced by that recordkeeper in the previous year that had affiliated advisors. This instrument satisfies the relevance condition because recordkeepers and affiliated advisors often work together as part of a service bundle offered consistently across their client plans. A recordkeeper servicing many plans that have affiliated advisors in one year could indicate the recordkeeper's focus on promoting these services, which is likely to persist and influence the use of affiliated advisors in other plans serviced by this same recordkeeper. It is also likely to satisfy the exclusion restriction because the lagged proportion reflects a recordkeeper's overall strategy, which reasonably influences plan performance outcomes indirectly through its effect on the presence of affiliated advisors, and not directly or via other unobserved factors. The evidence from the IV regressions is consistent with our ordinary least squares (OLS) results.

Finally, we directly examine the possibility that our findings may be caused by unobserved factors that simultaneously affect plan performance and correlate with the presence of affiliated advisors. In particular, recordkeepers might worsen the investment menu by introducing inferior investment options that benefit themselves, while convincing the plan sponsor to hire an affiliated advisor. If this is the case, the observed deterioration in performance outcomes could result from these menu changes rather than from the influence of affiliated advisors on participants' allocation decisions. To rule this out, we implement two tests. First, we examine whether the menu composition changes when a plan introduces an advisor that is affiliated with the recordkeeper. We measure menu change by the turnover of the investment options in a given plan in the year. Second, we examine the relationship between plan menu quality and the presence of affiliated advisors. We measure menu quality by equally weighting the alphas of all funds offered within each plan. If our results are driven by factors causing changes in the investment menus or their quality, rather than participants'

allocation decisions influenced by affiliated advisors, we would observe significant relationships between menu turnover or quality and affiliated advisors. Finding no such relationships in our tests strengthens the interpretation that the negative performance effects are primarily due to the influence of affiliated advisors on participants' allocation decisions.

If the affiliation between advisors and recordkeepers truly drives the deterioration in allocation-weighted alpha or its counterfactual-adjusted counterpart, we expect this effect to be concentrated in funds that are managed by the recordkeeper. The idea is that affiliated advisors may negatively affect performance of plan participants by influencing their allocations towards recordkeeper's proprietary funds. To test this idea, we condition on plans with investment menus that have at least one proprietary fund and one non-proprietary fund. For each plan, we compute allocation-weighted alpha separately for the sub-portfolio of the plan that includes only proprietary funds and the subset that includes non-proprietary funds. We find that the deleterious performance effects are confined to the plan sub-portfolios that include proprietary funds.

Our next analysis shows direct evidence of how affiliated advisors affect performance of plan participants. Specifically, we examine how affiliated advisors affect plan participant flows to the funds available within a plan during the year. We find that flows to the recordkeeper's proprietary funds are typically lower than flows to non-proprietary funds when advice is not available. However, the presence of an affiliated advisor within a plan offsets such behavior. That is, within the same plan and year, affiliated advisors seem to channel participant flows to the recordkeeper's proprietary funds, a pattern that does not extend to unaffiliated advisors. Combined with the performance results, these flow results point to affiliated advisors influencing participant behavior to further recordkeepers' interests over those of the plan participants.

Our results suggest that affiliated financial advisors introduce conflicts of interest that worsen the performance of plan participants. It is still plausible that plan participants receive nonperformance-related benefits after affiliated advisors are added to plans. For example, affiliated advisors could help plan participants by increasing their participation and investment rates, negotiating lower administrative fees with recordkeepers as part of their advisory arrangement or increasing their portfolio diversification. We find that affiliated advisors do not improve participation rates, lower administrative fees, or improve diversification outcomes. We observe only an economically modest increase in investment contributions, about \$125 in additional annual contributions per participant. This suggests that affiliated advisors are unlikely to provide other meaningful benefits to plan participants that offset the decline in investment performance.

Our study makes contributions to four interconnected strands of literature. First, we contribute to the literature that studies Defined Contribution (DC) plan designs. A long line of research studies how elements of plan design influence various aspects of employee behavior in retirement investing, such as participation, contribution rates, and portfolio choice. For instance, Choi et al. (2004) and Madrian and Shea (2001) document that automatic enrollment significantly increases participation rates in DC plans, while Beshears et al. (2023) show that higher default contribution rates increase savings. With respect to portfolio choice, Brown, Liang, and Weisbenner (2007) show that participants' portfolio allocations are influenced by the default investment options and the structure of the fund menu. Similarly, Mitchell and Utkus (2022) find that when TDFs are used as default investment options, they improve portfolio diversification and reduce idiosyncratic risk relative to participant-directed portfolios.

However, the role of advice in DC plans is an element of plan design that is less understood. Prior research shows that low financial literacy leads to suboptimal outcomes for participants in retirement plans (e.g., Clark, Lusardi, and Mitchell 2017; Tang et al. 2010; Benartzi and Thaler 2001), suggesting that financial advice can serve as a substitute or complement to financial literacy in improving participant outcomes (e.g., Reuter and Richardson 2022; Lusardi and Mitchell 2014; Collins 2012; Bhattacharya et al. 2012). However, the effectiveness of financial advice in helping employees with low financial

literacy improve their decision making in retirement plans should depend on its quality. Our study shows that the quality of financial advice is lower when advisors are affiliated with recordkeepers, likely due to conflicts of interest. Thus, plan sponsors should consider minimizing such affiliations to ensure that advice serves its intended function of supporting participants' goals.

Second, our study adds to the growing body of research studying how conflicts of interest among plan service providers affect DC plan design and participant outcomes. For example, Pool et al. (2016, 2022) document that recordkeepers structure investment menus to benefit themselves at the expense of plan participants. Building on this work, we identify a previously unexamined conflict of interest inherent in DC plan operations—the role of affiliated advisors. These advisors can influence participants' allocation decisions to further the recordkeepers' interests over those of the participants. Unlike prior studies focused on conflicts arising from menu design, we demonstrate that affiliated advisors introduce systematic biases beyond those arising from menu design alone. These biases result in poorer performance outcomes for participants. Thus, our study highlights that attention should be paid to advisor affiliations in the governance of DC plans.

Third, we contribute to a relatively small but important literature that examines financial advice in DC plans and its impact on participant outcomes. Chalmers and Reuter (2020) evaluate the value of "biased" investment advice within the Oregon University System Optional Retirement Plan (ORP), where brokers serving as advisors were compensated based on commissions. They show that the value of advice depends on plan design, particularly the type of default investment options available in the investment menu. Advice was more valuable when brokers were present, but low-cost, well-diversified default options like TDFs were unavailable. When high-quality defaults were introduced, the value of advice diminished to the point where plan designs with better default options could mitigate potentially biased financial advice. Similarly, using a sample of 23 DC plans with TIAA as the recordkeeper, Reuter and Richardson (2022) find that participants' demand for financial advice increases

with factors like age, account balances, contributions, and life events (e.g., marital changes), but decreases when TDFs are available, suggesting that high-quality defaults can crowd out investment advice. Our study identifies a new determinant of advice quality and value: advisor affiliations. Unlike prior research that examines how features of plan design, e.g., default options, influence the value of financial advice, we show that affiliations between advisors and recordkeepers can compromise advice quality and undermine participant outcomes.

Finally, our research relates to the broader literature that studies the effects of financial advice on households' financial choices and outcomes. This literature points to both benefits and adverse effects associated with financial advice. Some documented benefits include improvements in portfolio efficiency, enhanced diversification, increased stock market participation, greater tax efficiency, and the mitigation of behavioral biases.² However, when conflicts of interest are present, financial advice can harm recipients, leading to diminished investment performance.³ Our study extends this literature by showing that conflicts of interest in financial advice lead to poorer outcomes for investors within a new and increasingly important setting—investing in 401(k) plans. Given the growing accessibility of financial advice within 401(k) plans and the significant long-term wealth effects associated with rates of return on savings (Favilukis, 2013; Benhabib, Bisin, and Luo, 2017), our findings matter for households, plan sponsors, policymakers, and regulators.

2 **Institutional Background**

401(k) plans have become increasingly important for retirement saving in the United States. Not only have their assets grown from about \$1.7 trillion in 2000 to \$8.9 trillion in the third quarter of 2024, but now they constitute 70 percent of all Defined Contribution (DC) plan assets (ICI 2024a). Governed by the Employee Retirement Income Security Act of 1974 (ERISA), 401(k) plans are sponsored and overseen by employers, who consult recordkeepers (key service providers) to choose a menu of investment options and other plan features on

² E.g., Bhattacharya et al. (2012); Hoechle et al. (2018); Gennaioli, Shleifer, and Vishny (2015); Cici, Kempf, and Sorhage (2017); and Hackethal, Haliassos, and Jappelli (2012).

³ E.g., Bergstresser, Chalmers, and Tufano (2009); Hackethal, Haliassos, and Jappelli (2012); Kramer (2012); Del Guercio and Reuter (2014); Egan, Ge, and Tang (2022).

behalf of their employees. Many entities provide services to 401(k) plans, but the key ones are recordkeepers, investment managers, and financial advisors. While recordkeepers provide both administrative and operational services, such as plan reporting, managing participant accounts, processing contributions, and tracking investments, investment managers oversee the management of the underlying investment options available within the plan's investment menu, and financial advisors provide personalized investment and retirement-planning advice to participants.⁴ Importantly, recordkeepers often bundle services that include investment management, financial advice, and custody of plan assets.⁵

Perhaps not surprisingly, access to financial advice has become an increasingly important feature of 401(k) plans, driven in large part by a growing demand from plan participants. The growing demand is illustrated by a 2024 survey by Charles Schwab reporting that 61 percent of the survey participants think that their "financial situation <u>does</u> warrant advice," up from 55 percent in 2023. Furthermore, according to a survey by the Plan Sponsor Council of America (PSCA), about 40 percent of surveyed 401(k) plans disclosed offering financial advice in 2023, compared to 30% in 2019.⁶ The results from the PCSA survey suggest that rising demand for financial advice within 401(k) plans is being met with by greater availability of financial advice within these plans.

Financial advisors serving DC plan participants are considered fiduciaries under ERISA if their advice meets all the conditions of a five-part test established by the Department of Labor (DOL) in 1975. In essence, an advisor is a fiduciary if they provide regular, personalized investment advice under a mutual understanding between the involved parties that it will guide and serve as a primary basis for investment decisions in the plan. Trying to

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⁴ See ICI (2024b) for a description of the services provided in 401(k) plans. Note that there are also advisors that advise the plan sponsor on issues related to plan features and plan investment menu, but these are beyond the scope of our paper.

⁵ Recordkeepers can be asset management firms, insurance companies, brokerage firms, banks, or pure recordkeepers. Asset management firms tend to dominate the market, covering close to 60 percent of 401(k) plan assets as of 2021 (ICI 2024c).

⁶ Plan Sponsor Council of America, 67th and 63rd Annual Survey(s) of 401(k) and other profit-sharing plans.

⁷ To meet the 1975 fiduciary standard, a financial advisor must: (1) provide investment recommendations or advice on asset values; (2) do so regularly; (3) have a mutual understanding that the advice guides decisions; (4) ensure the advice is a primary basis for decisions; and (5) tailor the advice to the plan's specific needs, such as

ensure greater investor protection, the DOL has made repeated attempts in recent years to broaden the definition of what constitutes fiduciary advice, but these attempts proved unsuccessful. The DOL's recent efforts received severe opposition from industry groups, and as a result, the DOL's 2016 ruling was vacated in 2018 by the first Trump administration and its recent 2024 ruling was suspended due to legal challenges. Although the focus of our study is on fiduciary advice, it is important to clarify that, "advice" or "guidance" in 401(k) plans often refers to resources offered to plan participants that do not rise to the stricter level of fiduciary advice. Such resources include general educational tools, such as online retirement planning resources, workshops, or other financial wellness programs, aiming to enhance participants' financial literacy and support them in making informed retirement decisions. A considerable fraction, approximately 30 percent, of surveyed plan sponsors reported offering comprehensive financial wellness programs.

A lesser-known aspect related to advisors serving DC plan participants is that they are often affiliated with the plan's recordkeepers. This affiliation could take various forms: the advisor might be directly employed by the recordkeeper, the recordkeeper might own the advisory firm (or vice versa), or both entities might operate under the same parent company. At the same time, in what might be considered self-serving, many recordkeepers place their proprietary mutual funds in the investment menus of the 401(k) plans they service and are reluctant to remove underperforming proprietary funds from the menus (Pool et al. 2016). This practice hurts the performance of plan participants that invest in those funds. Because the sale of proprietary funds directly benefits the recordkeeper through increased management fees, the affiliated advisor may face implicit or explicit pressure to recommend these funds to plan participants. We hypothesize that such relationships between advisors and recordkeepers

investment strategy or diversification. All five criteria must be met to be considered a fiduciary (Definition of "Fiduciary" 1975).

⁸ See the U.S. Government Accountability Office (GAO) 2024 report on "Agencies Can Better Oversee Conflicts of Interest between Fiduciaries and Investors."

⁹ For example, HP Inc. provides *My HP Financial Wellness* through a dedicated website (https://www.myhpfinancialwellness.mysecurebenefitsportal.com/). This platform offers a variety of financial literacy resources, including materials developed by the company and resources supplied by Fidelity, the recordkeeper for HP Inc.'s 401(k) plan.

¹⁰ Plan Sponsor Council of America, 67th Annual Survey of 401(k) plans.

create incentives for advisors to steer plan participants toward proprietary investment options.

Similar conflicts of interest exist in other settings when advisors or brokers sell products tied to firms with which they have business relationships. In such instances brokers are incentivized to sell the products of certain firms because they receive higher commissions from them. For example, Christoffersen, Evans, and Musto (2013) show that mutual funds that pay higher commissions to brokers receive higher inflows, while Bergstresser, Chalmers, and Tufano (2009) document that broker-sold funds underperform direct-sold funds even after adding back the distribution fees paid by these funds. Similarly, Egan (2019) demonstrates that brokers, incentivized by kickbacks from issuers, often sell dominated bonds to their clients. The evidence from these studies suggests that business relationships between intermediaries tied to commission payments can harm investors' interests. Our analysis focuses specifically on affiliations arising through ownership links between advisors and recordkeepers, which are straightforward and unambiguous to identify. Such relationships can similarly distort the incentives of financial advisors and affect plan participants in an adverse fashion.

Echoing these concerns, a 2024 study by the Government Accountability Office (GAO) on conflicts of interest in retirement plans identifies relationships between affiliated plan service providers as a major source of conflict of interest inherent in the institutional workings of 401(k) plans (GAO 2024). The GAO defines this conflict as: "A firm or financial professional may also direct clients' assets to the products and services of an affiliated business, one in which the firm has a corporate relationship with the business or has a financial stake in the business." The concern according to GAO is that in such cases the affiliated entity "has an incentive to recommend the affiliated products rather than making such a determination based on a client's needs."

The conflicts of interest described above continue to attract regulatory and public scrutiny. Regulators are concerned that the current safeguards under ERISA are insufficient to protect plan participants' interests. This became apparent in the recent, albeit unsuccessful, efforts by

DOL to broaden the definition of fiduciary advice.¹¹ Furthermore, lawsuits such as *Shaffer v. Empower Retirement, LLC*¹² imply that potential conflicts of interest when advisors to plan participants are affiliated with the recordkeeper are being scrutinized. In this lawsuit, plaintiffs alleged that Empower's affiliated advisors were providing investment advice to plan participants while directing the participants' investments into Great-West and Putnam mutual funds—both affiliated with Empower—without disclosing their relationship with these investment managers. Even though the lawsuit was ultimately dismissed, the lawsuit itself and the coverage it received brought attention to potential conflicts of interest that can result from advisors' affiliations with recordkeepers and whether participants' interests are being adequately protected under the current regulations.

3 Data and Sample Characteristics

Our primary data on defined contribution 401(k) plans comes from BrightScope Beacon (BrightScope). BrightScope collects most of its data from Form 5500, which ERISA defined contribution plans are required to file annually with the Department of Labor. It also collects some data from plan sponsors and the Security and Exchange Commission (SEC).

Since our methodology relies on detailed investment menu information, we focus on 401(k) plans that provide this level of detail, which are plans with more than 100 participants. The BrightScope dataset includes approximately 74,402 such plans with detailed investment menu data from 2009 to 2019, which represent about 84% of the total assets in the universe of U.S. 401(k) plans that disclose investment menu data. This translates into 210,661plan-year observations. As explained later, for most of the tests we focus on plans that offer target date funds. This reduces the sample further to 112,030 plan year observations.

The BrightScope dataset provides annual plan-level information, including the identity of

¹¹ The 2016 ruling sought to extend fiduciary responsibilities to more advisers, including those providing onetime or incidental advice, but was vacated in 2018. Similarly, the 2024 ruling aimed to expand the definition of fiduciary advisers and investment advice; however, its implementation has been delayed due to legal challenges (GAO 2024)

¹² Shaffer v. Empower Retirement, LLC, No. 1:22-cv-02716-NYW (D. Colo. filed Oct. 14, 2022).

¹³ This is based on our own calculations, in which we compared the assets of plans with detailed investment menu information in BrightScope against the universe of all 401(k) plans that disclose such information in their Form 5500 filings with the DOL.

plan service providers—institutional entities that provide services to the plan, such as recordkeeping, investment management, and advisory service. It also includes annual aggregate plan characteristics, such as total assets, availability of auto-enrollment options, and number of participants in the plan. In addition, Brightscope provides annual data on each plan's investment menu composition and the total participant allocations in each investment option within the plan menu in a given year. We supplement the BrightScope data with additional information that we collect from Form 5500. Specifically, we extract total administrative fees from Schedule H.

The BrightScope data also include annual information on the roles of service providers in each 401(k) plan. We use these data to identify advisors that provide advice to plan participants. In addition, we study all advisor-recordkeeper pairs to determine whether the advisor shares an affiliation with the recordkeeper through ownership links. This affiliation could take various forms: the advisor might is the same entity as the recordkeeper, the recordkeeper owns the advisor (or vice versa), or both entities operate under the same parent company. We classify an advisor as being affiliated with a recordkeeper if either of the following conditions holds: (i) the advisor and recordkeeper share the same name and identification number in BrightScope or (ii) the advisor and recordkeeper are listed as separate entities in BrightScope with distinct names and identification numbers but have verifiable ownership links. We identify and confirm these links using publicly available data sources, such as company websites and Form ADV filings. Using this classification, we create our primary variable of interest, Affiliated Advisor, which equals one if the advisor is affiliated with the recordkeeper of the plan, and zero otherwise. We also create an analogous variable, *Unaffiliated Advisor*, which equals one if a plan's advisor is not affiliated with the plan's recordkeeper, and zero otherwise.

To conduct our tests that rely on investment menu data, we link BrightScope's mutual funds from each plan's investment menu with the CRSP Mutual Fund (CRSP MF) database using fund tickers provided by Brightscope. This linkage allows us to supplement the plan

menu data from BrightScope with fund characteristics from CRSP MF, which include funds' returns, expense ratios, turnover ratios, and total net assets. We also obtain monthly Fama-French factor returns from the Fama-French factor return dataset available in WRDS. Additionally, we use a bond factor return constructed as the excess return of the Bloomberg Barclays Aggregate Bond Index.

We report summary statistics for our data in Table 1. Each characteristic is first averaged at the plan level. We then compute and report statistics based on the cross-section of plans. We provide a detailed description of the variables in Appendix I. The average plan has about \$63 million in assets and has more than one million dollars in loans made against the plan assets. The average plan participant makes an annual contribution of \$5,547 to their 401(k) account and has a balance of about \$61,000. About 30 percent of the plans auto-enroll the sponsor's employees. In terms of investment options, the average plan has about 27 investment options, 23 of which are mutual funds. Accordingly, mutual funds represent a substantial proportion of the typical plan's investment menu. Moreover, the average fraction of mutual funds that are proprietary is about 22 percent, though there is substantial variation across plans, with some plans having more then 40 percent of investable funds as proprietary. The average total administrative fee as a percentage of plan assets amounts to 24 basis points while the average allocation-weighted fund expense ratio is 57 basis points, which is close to Pool et al. (2022), who report an allocation-weighted expense ratio 56 basis points, although their sample includes the 1,000 largest 401(k) plans.

In Figure 1, we plot the evolution of financial advisors' presence within 401(k) plans during our sample period. In 2009, about nine percent of plan assets have access to financial advice. By 2019, the proportion of plan assets with access to financial advice reached more than 20 percent. Notably, Figure 2 shows that about half of all plan assets with financial advisors have an advisor who is affiliated with the plan's recordkeeper.

4 Advisors and Performance Outcomes

4.1 Empirical Results

We examine the effect that the introduction of affiliated advisors has on the performance of plan participants by estimating the following ordinary least squares (OLS) regression:

$$Allocation \ Alpha_{j,t} = \alpha_0 + \beta_1 Affiliated \ Advisor_{j,t-1} + \theta' \textbf{\textit{X}}_{j,t-1} + \varepsilon_{j,t}(1)$$

Plan is denoted by j and year by t. **X** is a vector of control variables lagged by one year. The key independent variable is, $Affiliated \ Advisor_{j,t-1}$, an indicator variable identifying whether plan j has an affiliated advisor in year t-1.

Allocation Alpha_{j,t} measures the overall risk-adjusted performance earned by participants of plan *j* in year *t*. Its construction is as follows. We first calculate alphas of individual mutual funds included in a plan's investment menu using the four-factor Carhart (1997) model augmented with the excess return on the Barclay US Aggregate Bond Index. We add the bond factor to account for fixed income exposure either in bond funds or target date funds. We compute fund alpha for a given month as the difference between the actual fund return and the expected fund return. The expected return is calculated by applying factor loadings, estimated from regressions of the fund's prior 36 monthly excess returns on five factor-mimicking portfolios, to the realized factor returns in the current month. To be included in the estimation, we require a fund to have 18 monthly return observations within our rolling window. Monthly fund alphas are then compounded to compute an annual alpha measure for each fund. Next, at the plan level, we calculate *Allocation Alpha* by weighting the annual alphas of the individual funds making up the plan's investment menu by the participants' actual aggregate allocations in the respective funds at the beginning of year *t*.

In our regressions, we also include additional explanatory variables that may influence the performance of plan participants. Most notable among these is *Unaffiliated Advisor*, an indicator variable identifying whether a plan has an unaffiliated advisor. We include it to facilitate comparison between affiliated advisors and advisors who are not affiliated with plans' recordkeepers and to isolate the effect of advisors' affiliation on performance. The other control variables account for heterogeneity in plans' characteristics. They are the

number of funds available for investment within the plan, the total dollar amount of the plan's assets, the amount of loans against participants' balances within the plan, the average dollar amount contributed to the plan in the year, the average account balance, and an indicator that identifies whether the plan automatically enrolls individuals.

Our specifications also include plan fixed effects to account for plan-specific, time-invariant characteristics; recordkeeper fixed effects to control for recordkeeper-specific, time-invariant factors; and year fixed effects to absorb common time trends. With this fixed effects structure we are able to conduct a difference-in-differences estimation that identifies the effect of introducing affiliated (or unaffiliated) advisors relative to plans without financial advisors. We cluster the standard errors at the plan level and winsorize all plan-level variables at the 1% and 99% levels.

Columns (1) and (2) of Table 2 report results from the estimation of Equation (1). The specification of Column (1) includes only the *Affiliated Advisor* and *Unaffiliated Advisor* indicators, while that of Column (2) adds the control variables. Estimates from the specification in Column (2) show that the introduction of affiliated advisors to plans without one previously results in a risk-adjusted performance reduction of close to 22 basis points per year relative to plans in the comparison group, i.e., plans without advisors. The estimate is highly statistically significant (*t*-statistic = -4.32). Notably, this result does not depend on the inclusion or omission of the control variables, as it is stable across both regression specifications. ¹⁴ In contrast, the introduction of an unaffiliated advisor has no effect on performance. While the coefficient estimate is negative for *Unaffiliated Advisor*, its magnitude is indistinguishable from zero and not statistically significant. Furthermore, the reported p-value from an F-test testing the equality of the coefficients proves that the coefficients on the two advisor indicator variables are significantly different. The fact that

¹⁴ In addition, as demonstrated in Table IA1, our findings remain robust in the full sample of all 401(k) plans, although the magnitude of the effect is reduced to about 14 basis points. Moreover, to mitigate the concern that the results are driven by our alpha estimation process, we calculate allocation-weighted style-adjusted returns. We re-estimate our tests and report the results related to the style-adjusted returns in Table IA2. We find that after hiring an affiliated advisor, the allocation-weighted style-adjusted returns for funds in the plan decrease by 15 basis points.

affiliated advisors have a significantly negative effect on performance, while unaffiliated advisors do not, suggests that the negative impact of affiliated advisors comes from their affiliation with recordkeepers and the conflicts of interest it introduces, rather than their role as advisors.

4.2 Considering the Counterfactual

A potential concern is that the *Allocation Alpha* does not provide an accurate picture of how plan participants are affected by the introduction of affiliated advisors. The reason is that it ignores the counterfactual, which is the performance that plan participants would have realized if the plan did not have an affiliated advisor. To account for the counterfactual, we employ a similar approach to that of Chalmers and Reuter (2020) and use the returns of target date funds within a plan to capture the counterfactual performance that participants would have realized if an advisor was not present. The idea is that, in the absence of financial advice, plan participants are more likely to use target date funds (Chalmers and Reuter 2020). Thus, we benchmark the allocation alpha against the alpha of a counterfactual portfolio and refer to this counterfactual-adjusted performance measure as the *CF Alpha*.

We re-estimate Equation (1) using *CF Alpha* as the dependent variable and report the estimates in Columns (3)-(6). In Columns (3) and (4) the counterfactual portfolio is an allocation-weighted portfolio of all the TDFs available in the menu with weights determined by the actual allocations at the beginning of the year. For robustness, in Columns (5) and (6) the counterfactual portfolio is an equal-weighted portfolio of all the TDFs in the plan's menu. No matter which approach we use to determine weights in the counterfactual portfolio, the results suggest that after adjusting *Allocation Alpha* by the alpha of the counterfactual benchmark, the introduction of affiliated advisors is still associated with a decline in investment performance for the plan participants. For example, the specifications (with controls) of Columns (4) and (6) suggest a decline in *CF Alpha* of about 19 basis points. This decline is slightly lower in magnitude than the decline in *Allocation Alpha* but confirms that even after accounting for the performance of the counterfactual portfolio, the performance of

plan participants declines after the introduction of an affiliated advisor. Regarding the introduction of unaffiliated advisors, the evidence is consistent with the specification of Columns (1) and (2) that use *Allocation Alpha* as the dependent variable—their introduction has no significant impact on the performance outcomes of plan participants.

4.3. Addressing Endogeneity Concerns

To establish a causal link between affiliated advisors and participant performance outcomes, we need to consider potential endogeneity concerns. In particular, the decision to introduce an affiliated advisor may be influenced by unobserved factors, such as plan characteristics, employer preferences, or recordkeeper policies, which could also affect performance of plan participants. To mitigate these concerns, we conduct three sets of tests.

4.3.1. Parallel Trends Assessment and Time Pattern of the Performance Effect

Our tests in Table 2 exploit the staggered introductions of affiliated advisors across plans in a difference-in-differences design. To strengthen the casual interpretation of these results, we need to confirm that trends in the outcome variable were the same for both treated and control groups prior to the treatment. To this end, we estimate an augmented version of Equation (1) that includes two indicator variables, *Prior Period 1* and *Prior Period 2*, which capture plans with affiliated advisors in the first and second year prior to the affiliated advisor's introduction, respectively. To also understand the timing of the treatment effect due to the introduction of affiliated advisors, we replace *Affiliated Advisor* with two indicator variables that identify treated plans in the two periods after the introduction of the affiliated advisor, i.e., the first year after (termed *Post Period 1*) and all years from the second year onward (termed *Post Period 2*+). This allows us to assess how quickly the impact of affiliated advisors materializes.

Results from these augmented specifications are reported in Table 3. We also report the coefficients on the pre-period and post-period variables, along with their confidence intervals, in Figure 3. The estimates on *Prior Period 1* and *Prior Period 2* are not significantly different from zero, suggesting that participants' performance in plans which will have an affiliated advisor and the performance of participants in plans without advisors have parallel trends prior

to the introduction of affiliated advisors. This supports the validity of the difference-indifferences approach, and suggests that the observed performance deterioration, reflected in the coefficients of the *Post Period 1* and *Post Period 2+* variables, is due to the introduction of affiliated advisors rather than to pre-existing differences between treated and control plans.

Furthermore, the coefficient estimates show that the negative performance effect due to the introduction of an affiliated advisor intensifies with time. For example, Column (3) shows that *CF Alpha* declines by about 18 basis points in the first year after the introduction of an affiliated advisor while the decline in the subsequent period is about 31 basis points. This is consistent with the idea that it takes time for advisors' recommendation to influence the allocation decisions of plan participants.

Recent literature documents that estimates from a staggered difference-in-differences methodology can be biased (Baker, Larcker, and Wang 2022). In our setting, this would mean that the estimated effect of introducing an affiliated advisor could be contaminated by comparisons between plans that recently adopted affiliated advisors and those that adopted them in the more distant past. If the impact of affiliated advisors varies across cohorts or evolves over time, then these comparisons may lead to misleading conclusions. We use the model of Sun and Abraham (2021) to account for the potential "bad comparisons" problem. Table IA3 reports the results. Even when employing this alternative model, we still find a significant negative performance effect due to the introduction of an affiliated advisor. Moreover, the coefficients from this additional model are similar in terms of magnitude and statistical significance when compared with our baseline estimates.

4.3.2 Instrumental Variable

To further address potential endogeneity concerns, we employ an instrumental variable (IV) approach. We instrument for the presence of an affiliated advisor in plan j during year t using an instrument constructed at the recordkeeper level. Specifically, we compute *Proportion of Plans*, as the proportion of plans serviced by recordkeeper i, excluding plan j, that had an affiliated advisor in the prior year. This instrument satisfies the exclusion restriction because the

lagged proportion of a recordkeeper's plans that have affiliated advisors plausibly reflects the recordkeeper's broader operational strategy. For this reason, the instrument is likely to influence plan performance outcomes indirectly through its effect on the presence of an affiliated advisor, but not directly or via other unobserved factors. We estimate the following first-stage equation:

$$Affiliated\ Advisor_{j,i,t} = \alpha_0 + \beta_1 Proportion\ of\ Plans_{i,t-1} + \theta' \textbf{\textit{X}}_{j,t-1} + \varepsilon_{j,i,t} \quad (2)$$

In the regression, we include the same time-varying plan-level controls as in our baseline OLS specification (i.e., Equation (1)), as well as plan fixed effects to account for unobservable, time-invariant plan characteristics that may influence the advisor choice. We also incorporate recordkeeper fixed effects. We do so to ensure that our results are not driven by plan sponsors' selection of recordkeepers based on unobservable recordkeeper characteristics. Finally, year fixed effects are included to absorb potential time trends.

Column (1) of Table 4 reports the first-stage estimates. The coefficient on our instrument shows that the proportion of a recordkeeper's plans with an affiliated advisor is highly predictive of a plan onboarding an affiliated advisor in the following year. This is consistent with recordkeepers and affiliated advisors often working together as part of a service bundle and thus confirms the relevance of our instrument. Importantly, the sufficiently large F-statistic suggests that weak instrument bias is unlikely to be an issue in our setting.

The second-stage estimates from Columns (2) through (4) show that regardless of whether we examine overall risk-adjusted performance of participants or counterfactual-adjusted performance, having an advisor who is affiliated with the plan's recordkeeper reduces participants' performance outcomes. Similar to the evidence from the previous sections, we find negligible evidence that unaffiliated advisors affect performance outcomes, and statistical comparisons of the coefficients on the affiliated and unaffiliated advisor indicators consistently reveal significant differences.

4.3.3 Changes in Investment Menu Composition or Quality?

A reasonable conjecture is that our results could be caused by some other mechanism that simultaneously affects participants' performance and correlates with the presence of affiliated

advisors. For example, recordkeepers could reshuffle the investment menu by introducing inferior investment options that benefit themselves while convincing the plan sponsor to hire an affiliated advisor. In this case, the observed deterioration in performance could come from these menu changes rather than the influence of affiliated advisors on participants' allocation decisions. To examine this possibility, we implement two tests.

First, we examine whether the composition of the investment menu changes when a plan adds an advisor that is affiliated with the recordkeeper. We measure menu composition change by the turnover of the investment options in a given plan in the year, estimated as the minimum number of investment options added or removed in a year, divided by the number of investment options at the beginning of the year. We refer to this measure as *Menu Turnover*. We then estimate Equation (1) using *Menu Turnover* as the dependent variable. Results reported in Column (1) of Table 5 show that the introduction of affiliated advisors is not associated with variation in menu turnover, casting doubt on a link between investment menu changes and the introduction of affiliated advisors.

Our second test examines the relationship between menu quality and the presence of affiliated advisors. We measure menu quality using *Menu Alpha*, which is the equally weighted average alpha of all funds in the plan's investment menu. If our results are driven by factors causing changes in investment menu quality rather than participants' allocation decisions being influenced by affiliated advisors, we would observe a significant relationship between *Menu Quality* and *Affiliated Advisors*. We estimate Equation (1) with *Menu Alpha* as the dependent variable and report results in Column (2) of Table 5. We find no evidence that the introduction of affiliated advisors has an impact on *Menu Alpha*, as all coefficients are small in magnitude and not statistically significant.

Overall, we interpret this evidence to suggest that our baseline findings are not driven by changes in investment menu composition or quality. Importantly, the fact that *Menu Alpha* (equal-weighted) remains unaffected when affiliated advisors are introduced, while *Allocation Alpha* (allocation-weighted) declines significantly, suggests that the deterioration in participant performance is caused by changes in the participants' allocation decisions rather

than changes in menu quality.

5. How Do Affiliated Advisors Shape Fund Allocations?

The performance deterioration among plan participants following the introduction of affiliated advisors is consistent with these advisors affecting the allocation decisions of plan participants in a way that benefits the recordkeeper at the expense of participants' optimal allocation decisions. Affiliated advisors could do this by steering participants' investments toward the recordkeeper's proprietary funds. This is then likely to worsen the performance of plan participants since recordkeepers tend to add and retain poorly performing proprietary funds on plans' menus (Pool et al. 2016). We conduct two tests to examine this mechanism.

5.1. Recordkeeper Funds vs. Non-recordkeeper Funds

If the influence of affiliated advisors on plan participants' allocations contributes to the observed decline in *Allocation Alpha*, the performance deterioration should be more pronounced in the part of the aggregate plan portfolio that includes proprietary funds. To test this, we focus on plans that have at least one proprietary and one non-proprietary fund. We then decompose a plan's aggregate portfolio that reflects the collective allocation decisions of all plan participants into two sub-portfolios: one comprising all the proprietary funds (proprietary sub-portfolio) and the other including all non-proprietary funds (non-proprietary sub-portfolio). We compute an *Allocation Alpha* for each sub-portfolio and estimate Equation (1) separately for each sub-portfolio. As before, our key explanatory variable is *Affiliated Advisor*. We expect a negative and statistically significant coefficient on this variable when examining the proprietary sub-portfolio.

We report the estimates in Table 6. Column (1) shows results for the proprietary sub-portfolio, Column (2) for the nonproprietary sub-portfolio, and Column (3) for the entire portfolio. Note that Column (3) is similar to Column (2) of Table 2 but is instead based on a more restrictive sample that requires the presence of both proprietary and nonproprietary

funds.¹⁵ The evidence in Columns (1) and (2) show that the introduction of an affiliated advisor is associated with a significant decline in the *Allocation Alpha* for the proprietary subportfolio but not for the non-proprietary sub-portfolio. Participants' risk-adjusted performance related to the proprietary sub-portfolio declines by about 34 basis points. In contrast, Column (2) reports a positive, but statistically insignificant, coefficient on *Affiliated Advisor*, suggesting that affiliated advisors do not have a meaningful impact on that segment of the portfolio. These findings reinforce the idea that affiliated advisors primarily impact investment performance through their influence on proprietary fund allocations.

5.2 Advisors and Fund Flows

Our findings suggest that the performance of 401(k) participants declines following the introduction of affiliated advisors, with the decline primarily concentrated in the recordkeeper's proprietary funds. This suggests that affiliated advisors steer participants towards proprietary funds. If this is the case, we would expect the flow differential between proprietary and non-proprietary funds within a plan to widen in favor of proprietary funds when affiliated advisors are present.

To formally test this hypothesized relation, we estimate the following OLS regression:

$$Flow_{j,f,t} = a_0 + \beta_1 Proprietary Fund_{j,f,t}$$

$$+\beta_2 Affiliated\ Advisor_{j,t-1} \times Proprietary\ Fund_{j,f,t} + \phi' \textbf{X}_{f,t-1} + u_{f,t}\ (2)$$

where $Flow_{j,f,t}$ is the flow contributed to fund f of plan j during year t by the participants of plan j. $Proprietary Fund_{j,f,t}$ an indicator variable equal to one if fund f in plan f is a proprietary fund offered by the plan's recordkeeper, and zero otherwise. $Affiliated \ Advisor_{j,t-1}$ is an indicator variable identifying whether plan f has an affiliated advisor in year f is a vector of control variables to account for common determinants of fund flows, including a fund's realized

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¹⁵ Because of this restriction, the specifications in Table 6 have 45,767 observations versus 88,186 observations in Table 2. As a result, the decline in *Allocation Alpha* for the entire portfolio of approximately 32 basis points is greater than the 22 basis-point decline observed in Column (2) of Table 2. This is likely because plans that include proprietary funds provide affiliated advisors with more opportunities to influence participants' allocation decisions in a way that aligns with their interests. In contrast, if proprietary funds were absent, affiliated advisors would have fewer opportunities to steer allocations toward them, thereby limiting their overall impact.

returns, expense ratio, return volatility, turnover, and size. Importantly, we include plan by year fixed effects to capture differences in flows across funds within the same plan in the same year. We also include fund style fixed effects to control for common variation due to fund styles. We winsorize the dependent and explanatory variables at the at 1% and 99% levels.

The key coefficient of interest, β_2 , is on the interaction term between *Affiliated Advisor* and *Proprietary Fund*. This estimate captures the difference in flows to proprietary funds relative to non-proprietary funds when an affiliated advisor is present relative to plans when it is not present. We expect β_2 to be positive and significant if affiliated advisors channel flows to proprietary funds.

We employ four different versions for our flow measure. The first three are based on Pool et al. (2016) and the last one is based on Tran and Wang (2023).

Fund Flow
$$1_{j,f,t} = \frac{Value_{j,f,t} - Value_{j,f,t-1}*(1+R_{f,t})}{Value_{j,f,t-1}*(1+R_{f,t})}$$
 (3)

Fund Flow
$$2_{j,f,t} = \frac{Value_{j,f,t} - Value_{j,f,t-1}*(1+R_{f,t})}{Value_{j,f,t} + Value_{j,f,t-1}*(1+R_{f,t})}$$
 (4)

Fund Flow
$$3_{j,f,t} = \frac{Value_{j,f,t} - Value_{j,f,t-1} * (1 + R_{f,t})}{\sum_{f} Value_{j,f,t-1} * (1 + R_{f,t})}$$
 (5)

Fund Flow
$$4_{j,f,t} = \frac{Value_{j,f,t} - Value_{j,f,t-1}*(1+R_{f,t})}{\sum_{f} Value_{j,f,t-1}}$$
 (6)

In all the flow measures, the numerator captures the change in the plan's aggregate position in fund f during year t than is not attributable to the return appreciation of the fund, denoted by $R_{f,t}$. However, the denominator varies across the four measures. In $Fund\ Flow\ 1$, the denominator is the hypothetical end-of-year value of the position in fund f if there are no new money flows from plan participants. The denominator in $Fund\ Flow\ 2$ is the sum of the end-of-year and beginning-of-year position (allowed to grow by $R_{f,t}$) in fund f. In $Fund\ Flow\ 3$, the denominator captures the sum of all fund positions in the plan at t-t1 and is allowed to grow by the respective fund return during the year. The dominator in $Fund\ Flow\ 4$ is similar to that of $Fund\ Flow\ 3$ with the difference being that it sums all the positions in the respective funds of the plan at t-t1.

We report the regression results in Table 7. The coefficient on *Proprietary Fund* is consistently negative and statistically significant in all specifications corresponding to each version of the flow

measure. This suggests that, in the absence of affiliated or unaffiliated advisors, plan participants contribute lower flows to proprietary funds relative to non-proprietary funds. This could be due to potential concerns about conflicts of interest or a preference for non-proprietary options that may be more competitive in terms of performance (Pool et al. 2016).

Importantly, the coefficients on our key interaction term are consistently positive and statistically significant across all the regression specifications. The positive and significant coefficients on the interaction term suggest that when an affiliated advisor is present, the flow difference between proprietary and non-proprietary funds gets larger and favors proprietary funds. This means that affiliated advisors counter the tendency of plan participants to avoid proprietary funds (when affiliated advisors are not present), steering them towards recordkeepers' proprietary funds instead. The coefficients on the interaction between the proprietary fund and the unaffiliated advisor indicators are consistently positive but statistically insignificant. Thus, unlike affiliated advisors, unaffiliated advisors do not appear to influence participant flows towards recordkeepers' funds. Taken together, these findings support the hypothesis that affiliated advisors steer participants toward proprietary funds, which benefits the recordkeeper at the expense of participants' investment performance.

6. Do Affiliated Advisors Provide Any Benefits?

Our results so far suggest that the introduction of affiliated financial advisors leads to conflicts of interest that negatively impact the performance of plan participants. However, it is possible that plan participants might receive nonperformance-related benefits after affiliated advisors are added to plans. For example, affiliated advisors could help increase participation and investment rates of plan participants, ¹⁶ negotiate lower administrative fees with recordkeepers on their behalf as part of their advisory arrangement, or help increase their portfolio diversification. ¹⁷ If this is the case, then the introduction of affiliated advisors may not

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¹⁶In their model, Gennaioli, Shleifer, and Vishny (2015) show that trusted financial advisors create peace of mind for their clients, leading them to increase their stock market participation.

¹⁷ Prior literature documents that individual investors tend to under-diversify in their stock portfolios (Goetzmann and Kumar, 2008) or in their 401(k) plans (Poterba, 2003; Benartzi, Thaler, Utkus, and Sunstein, 2007). Furthermore, previous studies suggest that access to financial advice helps households improve diversification

necessarily have a net negative effect on plan participants.

To test whether the introduction of affiliated advisors is associated with any of these benefits, we estimate Equation (1) separately for each measure of benefit as the dependent variable. *Participation Rate* is the percentage of a sponsor's employees that are enrolled in the 401(k) plan in a given year. *Salary Deferral* is the average amount a plan participant contributes to the 401(k) plan during the year. *Administrative Fees* measures the total administrative fees as a percent of plan assets. To test for the presence of diversification benefits, we introduce a plan-level measure of participants' portfolio concentration, *Plan Concentration*, measured as:

Plan Concentration_{i,t} =
$$\frac{1}{2}\sum_{j=1}^{N_{i,t}=7} \left| w_{i,j,t} - \overline{W}_{j,t} \right|$$
 (7)

where $w_{i,j,t}$ is the weight of plan i's assets in asset class j in year t and $\overline{W}_{j,t}$ is the benchmark weight of asset class j. We classify plan holdings into seven asset classes: Target-date Funds, U.S. Equity, International Equity, Taxable Bond, Real Estate, Commodities, and Cash. Then, we aggregate the holdings in each of these asset classes to calculate the weight for each plan in each asset class in each year. We construct the benchmark portfolio by aggregating assets across all plans and then compute the benchmark weight, $\overline{W}_{j,t}$, for each asset class in the benchmark. A lower *Plan Concentration* value suggests greater diversification.

The estimation results are reported in Table 8. The coefficient on *Affiliated Advisor* is statistically insignificant for the specifications that employ *Participation Rate*, *Administrative Fees*, and *Plan Concentration* as dependent variables, suggesting that the introduction of affiliated advisors in a plan does not lead to higher participation rates in 401(k) plans by the employees, lower administrative fees, or broader diversification. We note that our tests are confined to and should be interpreted within the context of 401(k) plans. That is, we acknowledge that we cannot observe participants' decisions in any external investment

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⁽Kramer, 2012; van Gaudecker, 2015; Bekaert, Hoyem, Hu, and Ravina, 2017; Hoechle et al., 2017; Rossi and Utkus, 2024).

¹⁸ As a robustness check, for plans that do not have one or more asset classes available in the menu, we construct the benchmark to include only the assets classes that are available in the menu of the plan. Results remain the same when we use this alternative benchmark to compute weight deviations.

accounts they may own. Therefore, we cannot rule out that 401(k) participants apply the advice related to portfolio diversification that they receive from the affiliated advisors to their other investments outside of the 401(k) plan.

Only in the specification with *Salary Deferral* as the dependent variable is the coefficient on *Affiliated Advisor* positive and statistically significant, suggesting that the introduction of an affiliated advisor is associated with an increase in investment contributions by plan participants. However, this effect is economically modest, as the coefficient suggests an increase of about \$125 in the annual contribution per plan participant following the introduction of affiliated advisors. This estimate amounts to roughly 2 percent of the average annual contribution of \$5,547. Overall, these findings suggest that the introduction of affiliated advisors does not provide substantial measurable benefits to plan participants.

7 Conclusion

401(k) plans have become a key vehicle through which American households save for retirement. Notably, such plans are increasingly offering access to financial advisors for their participants, which raises questions about how these advisors impact plan participants' outcomes. While advisors embedded in 401(k) plans could improve the decision-making of plan participants, relationships between advisors and plan recordkeepers can potentially generate conflicts of interest between advisors and plan participants. We examine whether such relationships impact the performance and investment decisions of plan participants using data on a large sample of 401(k) plans in the United States.

We document that participants in plans that introduce financial advisors that are affiliated with the plan's recordkeepers subsequently experience lower investment performance after affiliated advisors are introduced to the plan. The performance deterioration is concentrated in proprietary funds offered by the recordkeepers, towards which affiliated advisers tend to steer plan participants' savings. Notably, we do not observe a similar negative effect when plans add unaffiliated advisors, which supports the conclusion that the observed decline in performance associated with the introduction of affiliated advisors stems from conflicts of

interest rather than the general role of financial advisors. Importantly, we rule out that the reduction in performance outcomes following the introduction of affiliated advisors is due to affiliated advisors influencing plan menu design.

We find no evidence that affiliated advisors improve participation rates, lower administrative fees, or improve diversification outcomes. We observe only a small increase in investment contributions, which is of a small economic magnitude. Based on this evidence, we conclude that affiliated advisors do not provide meaningful benefits to participants that would offset the decline in investment performance following their introduction to a plan. Given the growing reliance of households on 401(k) plans to save for retirement and the long-term wealth effects associated with rates of return on savings, our finding that affiliated advisors have an adverse effect on participants' performance have important implications for plan participants, sponsors, and policymakers.

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Figure 1: Evolution of Financial Advisors Within 401(k) Plans

The figure shows the yearly percentage of total assets in 401(k) plans that have financial advisors. Specifically, the solid line plots, in each year, the total assets in 401(k) plans with financial advisors scaled by the total assets of all 401(k) plans in our sample.

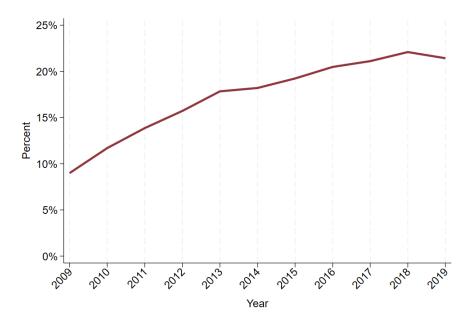


Figure 2: Evolution of Affiliated Advisors Within 401(k) Plans

The figure shows the yearly percentage of total assets in 401(k) plans that have financial advisors who are affiliated with the plan's recordkeeper. Specifically, the solid line plots, in each year, the total assets in 401(k) plans with affiliated advisors scaled by the total assets of all 401(k) plans in our sample.

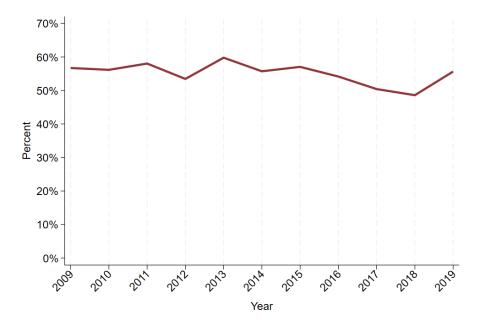
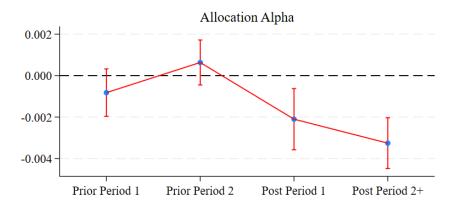
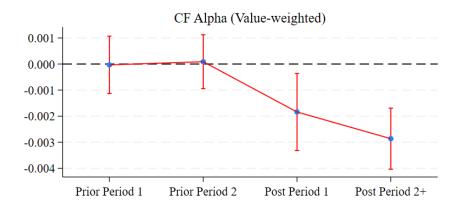


Figure 3: Parallel Trends Assessment and Time Pattern of the Performance Effect

The figure shows how risk-adjusted performance of 401(k) plans changes around the hiring of an affiliated advisor. The top plot shows how *Allocation Alpha*, which is the value-weighted alpha of all mutual funds in a plan in a year, changes around the hiring of an affiliated advisor, relative to the performance of plans without advisors. The middle plot depicts how *CF Alpha (Value-weighted)*, which is the difference between *Allocation Alpha* and the alpha of the value-weighted counterfactual portfolio, varies around the hiring of an affiliated advisor, relative to the performance of plans without advisors. The bottom plot depicts how *CF Alpha (Equal-weighted)*, which is the difference between *Allocation Alpha* and the alpha of the equal-weighted counterfactual portfolio, varies around the hiring of an affiliated advisor, relative to the performance of plans without advisors.





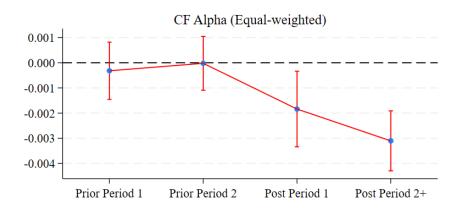


Table 1: Summary Statistics

The table reports descriptive statistics, including the means, medians, standard deviations, and percentiles for our variables. All variables are defined in Appendix I.

	Mean	Std. Deviation	25th Pctl.	Median	75 th Pctl.	N.
Account Balance (\$thousands)	61.147	68.342	27.058	46.365	75.305	52,747
Administrative Fees (%)	0.236	0.292	0.032	0.118	0.338	52,747
Asset Weighted Expense (%)	0.566	0.295	0.330	0.527	0.727	52,747
Automatic Enrollment (%)	30.026	43.566	0.000	0.000	87.500	52,747
Investment Count	26.641	9.775	21.333	26.000	30.500	52,747
Mutual Fund Count	23.007	10.515	17.000	23.000	28.000	52,747
Participant Loan Value (\$thousands)	1,075.190	9,190.380	36.815	151.859	422.829	52,747
Participation Rate (%)	72.295	88.357	57.309	80.770	93.030	52,747
Plan Assets (\$millions)	63.330	514.960	4.773	10.675	26.989	52,747
Proprietary Fund Percent (%)	21.704	30.375	0.000	2.381	40.673	52,747
Salary Deferral (\$thousands)	5.547	44.891	2.696	4.124	6.344	52,747

Table 2: Advisors and Performance Outcomes

The table reports estimates from OLS regressions of the effects of advisors on performance. The dependent variable in the specifications of Columns (1) and (2) is *Allocation Alpha*, which is the value-weighted alpha of all mutual funds in a plan in a year. The dependent variable in the specifications of Columns (3) and (4) is *CF Alpha (Value-weighted)*, which is the difference between *Allocation Alpha* and the alpha of the value-weighted counterfactual portfolio. The dependent variable in the specifications of Columns (5) and (6) is *CF Alpha (Equal-weighted)*, which is the difference between *Allocation Alpha* and the alpha of the equal-weighted counterfactual portfolio. The key explanatory variable, *Affiliated Advisor*, equals one if the advisor is affiliated with the plan's recordkeeper, and zero otherwise. All variables are defined in Appendix I. Standard errors are clustered at the plan level and *t*-statistics are presented in parentheses. Significance at the 10%, 5%, and 1% levels is denoted by *, **, and ***, respectively.

	Allocation Alpha		CF Alpha (Va	alue-weighted)	CF Alpha (Ec	ual-weighted)
	(1)	(2)	(3)	(4)	(5)	(6)
Affiliated Advisor	-0.00179***	-0.00216***	-0.00152***	-0.00192***	-0.00139***	-0.00193***
	(-4.05)	(-4.32)	(-3.45)	(-3.87)	(-3.10)	(-3.89)
Unaffiliated Advisor	-0.00005	-0.00026	0.00003	-0.00005	0.00015	-0.00007
	(-0.17)	(-0.80)	(0.10)	(-0.15)	(0.51)	(-0.21)
Log(Investment Count)		-0.00077**		-0.00024		-0.00081***
		(-2.50)		(-0.81)		(-2.73)
Log(Plan Assets)		0.00037		0.00005		0.00014
		(1.54)		(0.22)		(0.62)
Log(Participant Loan Value)		0.00001		-0.00000		-0.00001
		(0.26)		(-0.14)		(-0.47)
Log(Salary Deferral)		-0.00008		0.00002		0.00003
		(-1.11)		(0.21)		(0.38)
Log(Account Balance)		0.00008		-0.00005		0.00007
		(0.32)		(-0.18)		(0.26)
Automatic Enrollment		-0.00085***		-0.00065***		-0.00074***
		(-3.58)		(-2.76)		(-3.14)
P-value of F-statistics	0.0007	0.0010	0.0029	0.0014	0.0061	0.0034
N	112,030	88,186	112,030	88,186	112,030	88,186
Adj. R-sq.	0.784	0.784	0.303	0.265	0.329	0.299
Plan FE	YES	YES	YES	YES	YES	YES
Year FE	YES	YES	YES	YES	YES	YES
Recordkeeper FE	YES	YES	YES	YES	YES	YES

Table 3: Temporal Effects of Advisors on Performance Outcomes

The table reports estimates from regressions of the effects of advisors on performance. The dependent variable used in the regression reported in Column (1) is *Allocation Alpha*, which is the value-weighted alphas of all mutual funds in a plan in a year. The dependent variable used in the regression reported in Column (2) is *CF Alpha (Value-weighted)*, which is the difference between *Allocation Alpha* and the alpha of the value-weighted counterfactual portfolio. The dependent variable used in the regression reported in Column (3) is *CF Alpha (Equal-weighted)*, which is the difference between *Allocation Alpha* and the alpha of the equal-weighted counterfactual portfolio. Indicator variables *Prior Period 1* and *Prior Period 2* capture plans with affiliated advisors in the first and second year prior to the advisor's introduction, respectively. *Post Period 1* is an indicator variable that identifies treated plans in the first year after the introduction of the affiliated advisor and *Post Period2+* identifies treated plans in all years from the second year onward. All other variables are defined in Appendix I. Standard errors are clustered at the plan level and *t*-statistics are presented in parentheses. Significance at the 10%, 5%, and 1% levels is denoted by *, **, and ***, respectively.

	(1)	(2)	(3)
		CF Alpha	CF Alpha
	Allocation Alpha	(Value-weighted)	(Equal-weighted)
Prior Period 2	-0.00082	-0.00003	-0.00032
	(-1.41)	(-0.06)	(-0.55)
Prior Period 1	0.00063	0.00009	-0.00002
	(1.14)	(0.17)	(-0.04)
Post Period 1	-0.00210***	-0.00184**	-0.00184**
	(-2.79)	(-2.44)	(-2.40)
Post Period 2+	-0.00326***	-0.00286***	-0.00310***
	(-5.21)	(-4.79)	(-5.11)
Unaffiliated Advisor	-0.00017	-0.00003	-0.00005
	(-0.52)	(-0.09)	(-0.15)
Log(Investment Count)	-0.00072**	-0.00024	-0.00081***
	(-2.23)	(-0.82)	(-2.73)
Log(Plan Assets)	0.00031	0.00004	0.00013
	(1.27)	(0.19)	(0.59)
Log(Participant Loan Value)	0.00001	-0.00000	-0.00001
-	(0.20)	(-0.14)	(-0.48)
Log(Salary Deferral)	-0.00006	0.00001	0.00003
,	(-0.76)	(0.18)	(0.35)
Log(Account Balance)	0.00012	-0.00004	0.00007
,	(0.46)	(-0.14)	(0.30)
Automatic Enrollment	-0.00084***	-0.00065***	-0.00074***
	(-3.42)	(-2.74)	(-3.13)
N	88,186	88,186	88,186
Adj. R-sq.	0.794	0.302	0.279
Plan FE	YES	YES	YES
Year FE	YES	YES	YES
Recordkeeper FE	YES	YES	YES

Table 4: Advisors and Performance Outcomes: Evidence from Instrumental Variable

Regressions

The table reports IV estimates of the effects of advisors on performance. The instrumental variable, *Proportion of Plans*, is the total proportion of plans serviced by a plan's recordkeeper, excluding the plan of interest, that have an affiliated advisor in the prior year. Column (1) reports first-stage estimates from Equation (2). Columns (2) through (4) report second-stage estimates. The dependent variables are specified in the column headers. The key explanatory variable is *Affiliated Advisor*, which equals one if the advisor is affiliated with the plan's recordkeeper, and zero otherwise. All variables are defined in Appendix I. Standard errors are clustered at the plan level and *t*-statistics are presented in parentheses. Significance at the 10%, 5%, and 1% levels is denoted by *, **, and ***, respectively.

-	(1)	(2)	(3)	(4)
	First-stage	Allocation	CF Alpha	CF Alpha
	C	Alpha	(Value-weighted)	(Equal-weighted)
Proportion of Plans	0.81835***			
	(3.26)			
Affiliated Advisor		-0.03472**	-0.07555***	-0.08302***
		(-2.02)	(-2.98)	(-3.06)
Unaffiliated Advisor	-0.00979	-0.00062	-0.00033	-0.00058
	(-1.45)	(-1.46)	(-0.53)	(-0.87)
Log(Investment Count)	0.00200	0.00013	0.00008	0.00014
	(0.37)	(0.30)	(0.14)	(0.24)
Log(Plan Assets)	0.00002	-0.00039	-0.00046	-0.00100**
	(0.01)	(-1.04)	(-0.99)	(-2.07)
Log(Participant Loan Value)	-0.00014	-0.00002	-0.00004	-0.00004
	(-0.35)	(-0.49)	(-0.98)	(-0.96)
Log(Salary Deferral)	0.00444***	0.00003	0.00033	0.00034
	(2.83)	(0.21)	(1.60)	(1.58)
Log(Account Balance)	-0.00060	-0.00041	-0.00039	-0.00033
	(-0.15)	(-1.16)	(-0.87)	(-0.71)
Automatic Enrollment	0.00531	0.00047	0.00027	0.00043
	(1.20)	(1.31)	(0.58)	(0.87)
First-stage F-statistic	10.62			
Second-stage F-statistic		4.00	8.94	9.36
P-value of F-statistic		0.0454	0.0028	0.0022
N	58,307	58,307	58,307	58,307
Plan FE	YES	YES	YES	YES
Year FE	YES	YES	YES	YES
Recordkeeper FE	YES	YES	YES	YES

Table 5: Variation in Menu Composition and Quality

The table reports OLS estimates of the relations between advisors and investment menu composition and quality. The dependent variable in each regression is indicated in the column header. The key explanatory variable is *Affiliated Advisor*, which equals one if the advisor is affiliated with the plan's recordkeeper, and zero otherwise. All variables are defined in Appendix I. Standard errors are clustered at the plan level and *t*-statistics are presented in parentheses. Significance at the 10%, 5%, and 1% levels is denoted by *, ***, and ****, respectively.

	(1)	(2)
	Menu Alpha	Menu Turnover
Affiliated Advisor	-0.00115	0.00034
	(-1.55)	(1.21)
Unaffiliated Advisor	-0.00064*	-0.00004
	(-1.85)	(-0.23)
Log(Investment Count)	-0.00064	-0.00044**
	(-1.50)	(-2.22)
Log(Plan Assets)	0.00010	0.00020
	(0.42)	(1.36)
Log(Participant Loan Value)	0.00001	-0.00000
	(0.52)	(-0.16)
Log(Salary Deferral)	0.00002	0.00002
,	(0.35)	(0.54)
Log(Account Balance)	-0.00037	-0.00009
,	(-1.22)	(-0.60)
Automatic Enrollment	-0.00061*	-0.00049***
	(-1.92)	(-3.72)
N	88,186	88,186
Adj. R-sq.	0.848	0.110
Plan FE	YES	YES
Year FE	YES	YES
Recordkeeper FE	YES	YES

Table 6: Performance Across Proprietary and Non-proprietary Funds

The table reports OLS estimates of the relations between advisors and performance across recordkeepers' proprietary funds and non-recordkeeper funds. The dependent variable used in the regressions is *Allocation Alpha*, which is the value-weighted alphas of all mutual funds in a plan in a year. The key explanatory variable is *Affiliated Advisor*, which equals one if the advisor is affiliated with the plan's recordkeeper, and zero otherwise. Column (1) reports estimates based on the sub-portfolio of proprietary funds while Column (2) reports estimates from the non-proprietary sub-portfolio. Column (3) shows estimates from using all funds in the restricted sample that requires the presence of both proprietary and nonproprietary funds. All variables are defined in Appendix I. Standard errors are clustered at the plan level and t-statistics are presented in parentheses. Significance at the 10%, 5%, and 1% levels is denoted by *, **, and ***, respectively.

	(1)	(2)	(3)
	Proprietary Funds	Non-proprietary Funds	All Funds
Affiliated Advisor	-0.00341***	0.00114	-0.00316***
Allillated Advisor			
** 0011	(-2.79)	(0.73)	(-3.88)
Unaffiliated Advisor	0.00048	-0.00091	-0.00054
	(0.56)	(-1.17)	(-1.23)
Log(Investment Count)	-0.00391***	0.00220***	-0.00130***
	(-5.09)	(2.71)	(-3.00)
Log(Plan Assets)	0.00181***	-0.00112*	0.00020
	(3.54)	(-1.74)	(0.62)
Log(Participant Loan Value)	0.00015***	-0.00010	0.00005
	(2.64)	(-1.48)	(1.40)
Log(Salary Deferral)	-0.00006	0.00004	0.00002
	(-0.27)	(0.20)	(0.16)
Log(Account Balance)	0.00024	-0.00113	0.00023
	(0.39)	(-1.53)	(0.64)
Automatic Enrollment	-0.00130**	-0.00101	-0.00121***
	(-2.51)	(-1.47)	(-3.49)
P-value of F-statistics	0.0083	0.2262	0.0037
N	45,767	45,767	45,767
Adj. R-sq.	0.818	0.612	0.458
Plan FE	YES	YES	YES
Year FE	YES	YES	YES
Recordkeeper FE	YES	YES	YES

Table 7: Advisors and Fund Flows

The table reports OLS estimates of the relations between advisors and flows to funds. The dependent variable used in each regression is indicated in the column header. Fund Flow 1 is the dollar flows into the mutual fund in year t divided by the product of the mutual fund balance in the plan during year t-1 and the mutual fund returns generated in year t. Fund Flow 2 is the dollar flows into the mutual fund in the year t divided by the sum of the mutual fund balance in the plan during year t-1 and the mutual fund returns generated in year t. Fund Flow 3 is the dollar flows into the mutual fund in the year t divided by the sum of the product of every mutual fund balance in the plan during year t-1 and the mutual fund returns generated in year t. Fund Flow 4 is the dollar flows into the mutual fund in the year t divided by the sum of the product of every mutual fund balance in the plan during year t-1. Proprietary Fund equals one if the fund is a proprietary fund offered by the plan's recordkeeper, and zero otherwise. Affiliated Advisor equals one if the advisor is affiliated with the plan's recordkeeper, and zero otherwise. All variables are defined in Appendix I. Standard errors are clustered at the fund level and t-statistics are presented in parentheses. Significance at the 10%, 5%, and 1% levels is denoted by *, **, and ***, respectively.

	(1)	(2)	(3)	(4)
	Fund Flow 1	Fund Flow 2	Fund Flow 3	Fund Flow 4
Proprietary Fund	-0.20867***	-0.02460***	-0.00074***	-0.00083***
	(-11.09)	(-8.37)	(-4.29)	(-4.37)
Proprietary Fund x Affiliated Advisor	0.20223***	0.03785***	0.00158***	0.00176***
	(2.88)	(4.77)	(3.01)	(3.05)
Proprietary Fund x Unaffiliated Advisor	0.05054	0.00493	0.00033	0.00032
	(1.39)	(1.06)	(1.26)	(1.10)
Fund Return	0.63757***	0.17500***	0.01141***	0.01206***
	(7.80)	(15.33)	(16.46)	(15.96)
Fund Expense Ratio	-0.38949***	-0.06050***	-0.00265***	-0.00290***
	(-8.82)	(-9.02)	(-7.74)	(-7.59)
Fund Return Volatility	-1.33047	0.39399**	0.01706	0.02103
	(-1.45)	(2.24)	(1.22)	(1.34)
Fund Turnover Ratio	-0.05843***	-0.00892***	-0.00028***	-0.00033***
	(-4.16)	(-4.98)	(-2.67)	(-2.86)
Fund Size	-0.13658***	-0.01458***	0.00010	0.00011
	(-9.21)	(-7.90)	(1.58)	(1.59)
P-value of F-statistics	0.0523	0.0002	0.0243	0.0184
N	1,076,584	1,076,651	1,076,658	1,076,658
Adj. R-sq.	0.105	0.155	0.267	0.269
Plan x Year FE	YES	YES	YES	YES
Style FE	YES	YES	YES	YES

Table 8: Benefits of Advice

The table reports OLS estimates of the relations between advisors and potential nonperformance benefits of advice. The dependent variable used in each regression is indicated in the column header. *Participation Rate* is the proportion of the plan sponsor's employees enrolled in the plan in the year. *Salary Deferral* is the average dollar amount (in thousands) of new money contributed per employee to the plan during the year. *Administrative Fees* is the total administrative fees paid by the plan in the year divided by the plan's assets in the year. *Plan Concentration* measures the concentration of the plan participants' portfolios across asset classes based on their investment allocations. *Affiliated Advisor* equals one if the advisor is affiliated with the plan's recordkeeper, and zero otherwise. All variables are defined in Appendix I. Standard errors are clustered at the plan level and t-statistics are presented in parentheses. Significance at the 10%, 5%, and 1% levels is denoted by *, **, and ***, respectively.

	(1)	(2)	(3)	(4)
	Participation Rate	Salary Deferral	Administrative Fees	Plan Concentration
Affiliated Advisor	-0.23950	0.12530**	0.00529	0.51031
	(-0.27)	(2.09)	(0.96)	(1.31)
Unaffiliated Advisor	-0.48332	0.00728	0.02049***	0.08242
	(-1.22)	(0.18)	(3.90)	(0.42)
Log(Investment Count)	-0.02324	-0.00172	-0.00014	-0.02852***
	(-0.89)	(-1.23)	(-0.94)	(-4.00)
Log(Plan Assets)	4.23191**	0.38051***	-0.00929**	-0.88627**
	(2.18)	(9.16)	(-2.25)	(-3.01)
Log(Participant Loan Value)	0.04337	-0.00127	0.00036	0.00069
	(0.67)	(-0.39)	(1.07)	(0.06)
Log(Salary Deferral)	-6.77941		-0.00363**	-0.13703**
	(-1.18)		(-2.26)	(-2.32)
Log(Account Balance)	2.79558	0.52232***	-0.04205***	-0.57297**
	(0.32)	(11.37)	(-9.09)	(-2.52)
Automatic Enrollment	4.37308***	-0.12062***	0.01150***	0.29131
	(7.37)	(-4.15)	(3.63)	(1.69)
N	87,639	87,639	82,918	88,192
Adj. R-sq.	0.355	0.896	0.851	0.889
Plan FE	YES	YES	YES	YES
Year FE	YES	YES	YES	YES
Recordkeeper FE	YES	YES	YES	YES

Appendix I. Variable Definitions

Key Variables				
Name	Definition			
Allocation Alpha	The value-weighted alphas of all mutual funds in a plan in a year.			
CF Alpha	The difference between Allocation Alpha and the alpha of the value-weighted or equal-weighted counterfactual portfolio in a year.			
Affiliated Advisor	Indicator equal to one if the advisor is affiliated with the plan's recordkeeper, and zero otherwise.			
Unaffiliated Advisor	Indicator equal to one if the advisor is not affiliated with the plan's recordkeeper, and zero otherwise.			
Menu Turnover	The minimum number of proprietary investment options added or deleted from the menu in a year scaled by the total number of investment options in the menu in the prior year.			
Participation Rate	The proportion of the plan sponsor's employees enrolled in the plan in the year.			
Administrative Fees	The total administrative fees paid by the plan in the year, as reported on the plan's Form 5500, divided by the plan's assets in the year.			
Plan Concentration	Measures the concentration of the plan participants' portfolios across asset classes based on their investment allocations.			
Fund Flow 1	Dollar flows into the mutual fund in year t , divided by the product of the mutual fund balance in the plan during year t - 1 and the mutual fund returns generated in year t .			
Fund Flow 2	Dollar flows into the mutual fund in year <i>t</i> divided by the sum of the mutual fund balance in the plan during year <i>t</i> and the product of the mutual fund balance in the plan during year <i>t-1</i> and the mutual			
Fund Flow 3	Dollar flows into the mutual fund in year t divided by the sum of the product of every mutual fund balance in the plan during year t - I and the mutual fund returns generated in year t .			
Fund Flow 4	Dollar flows into the mutual fund in the year t divided by the sum of the product of every mutual fund balance in the plan during year t - 1 .			
	Additional Variables			
Account Balance	Account value, in thousands of dollars, of the plan's average participant.			
Account Barance	Account value, in thousands of dollars, of the plan's average participant.			
Automatic Enrollment	Indicator equal to one if the plan automatically enrolls participants during the year, and zero otherwise.			
Fund Expense Ratio	The expense ratio of the mutual fund during the year.			
Investment Count	Total number of investment options in the plan.			
Participant Loan Value	Total dollar amount of loans (in thousands) against participants' plan balances.			
Plan Assets	The total dollar amount (in millions) of assets in the plan.			
Fund Return	The annualized monthly return of the mutual fund during the year.			
Fund Return Volatility	The annualized monthly return volatility of the mutual fund during the year.			
Salary Deferral	The average dollar amount (in thousands) of new money contributed per employee to the plan during			
Fund Size	the year. The total dollar value of assets (in billions) managed by the mutual fund during the year.			
Fund Turnover Ratio	The portfolio turnover of the mutual fund during the year reported in CRSP MF Database.			
Proprietary Fund	Indicator equal to one if the fund is a proprietary fund offered by the plan's recordkeeper, and zero otherwise			

Internet Appendix

Table IA1: Advisor and Performance Outcomes Using the Full Data Sample

The table reports estimates from OLS regressions of the effects of advisors on performance using the full data sample. The dependent variable used in the regressions, *Allocation Alpha*, is the value-weighted alpha of all mutual funds in a plan in a year. The key explanatory variable, *Affiliated Advisor*, equals one if the advisor is affiliated with the plan's recordkeeper, and zero otherwise. All variables are defined in Appendix I. Standard errors are clustered at the plan level and *t*-statistics are presented in parentheses. Significance at the 10%, 5%, and 1% levels is denoted by *, **, and ***, respectively.

	(1)	(2)
Affiliated Advisor	-0.00125***	-0.00143***
	(-4.01)	(-4.16)
Unaffiliated Advisor	-0.00037	-0.00053*
	(-1.48)	(-1.84)
Log(Investment Count)		-0.00110***
		(-4.42)
Log(Plan Assets)		0.00099***
		(4.94)
Log(Participant Loan Value)		0.00000
		(0.03)
Log(Salary Deferral)		-0.00009
		(-1.47)
Log(Account Balance)		-0.00014
		(-0.64)
Automatic Enrollment		-0.00059***
		(-3.01)
P-value of F-statistics	0.0224	0.0352
N	210,661	165,564
Adj. R-sq.	0.694	0.692
Plan FE	YES	YES
Year FE	YES	YES
Recordkeeper FE	YES	YES

Table IA2: Advisor and Performance Outcomes Using Style-adjusted Returns

The table reports estimates from OLS regressions of the effects of advisors on performance measured using style adjusted returns. Each year, the style-adjusted return for a mutual fund is calculated as the difference between its reported return and the average return of all funds with the same investment style. The dependent variable used in the specification of Column (1) is *Allocation Style-Adjusted Return*, which is the value-weighted style-adjusted return of all mutual funds in a plan in a year. The dependent variable used in the specification of Column (2) is *CF Style-Adjusted Return (Value-weighted)* and is measured as the difference between *Allocation Style-Adjusted Return* and the style-adjusted return of the value-weighted counterfactual portfolio. The dependent variable in the specification of Column (3), *CF Style-Adjusted Return (Equal-weighted)*, is measured as the difference between *Allocation Style-Adjusted Return* and the style-adjusted return of the equal-weighted counterfactual portfolio. The key explanatory variable, *Affiliated Advisor*, equals one if the advisor is affiliated with the plan's recordkeeper, and zero otherwise. All variables are defined in Appendix I. Standard errors are clustered at the plan level and *t*-statistics are presented in parentheses. Significance at the 10%, 5%, and 1% levels is denoted by *, **, and ***, respectively.

-	(1)	(2)	(3)
	Allocation	CF Style-Adjusted Return	CF Style-Adjusted Return
	Style-Adjusted Return	(Value-weighted)	(Equal-weighted)
Affiliated Advisor	-0.00152***	-0.00120**	-0.00153***
	(-3.11)	(-2.14)	(-2.76)
Unaffiliated Advisor	-0.00035	-0.00067*	-0.00074*
	(-1.06)	(-1.71)	(-1.89)
Investment Count	0.00003***	0.00003*	0.00003**
	(3.22)	(1.89)	(2.43)
Plan Assets	-0.00099***	-0.00118***	-0.00087***
	(-3.95)	(-4.00)	(-2.94)
Participant Loans	-0.00002	-0.00004	-0.00007**
	(-0.60)	(-1.46)	(-2.53)
Salary Deferrals	0.00002	-0.00016*	-0.00008
	(0.25)	(-1.66)	(-0.82)
Account Balance	0.00060**	0.00032	0.00024
	(2.28)	(1.04)	(0.79)
Automatic Enrollment	-0.00102***	-0.00003	-0.00002
	(-4.44)	(-0.10)	(-0.08)
P-value of F-statistics	0.0420	0.4456	0.2526
N	88,192	88,192	88,192
Adj. R-sq.	0.435	0.260	0.297
Plan FE	YES	YES	YES
Year FE	YES	YES	YES
Recordkeeper FE	YES	YES	YES

Table IA3: Effects of Advisors on Performance Using the Correction of Sun and Abraham (2021).

The table reports estimates of the effects of advisors on performance from regressions using the methodology of Sun and Abraham (2021). The dependent variable in the specification of Column (1) is *Allocation Alpha*, which is the value-weighted alpha of all mutual funds in a plan in a year. The dependent variable in the specification of Column (2) is *CF Alpha (Value-weighted)*, which is the difference between *Allocation Alpha* and the alpha of the value-weighted counterfactual portfolio. The dependent variable in the specification of Column (3) is *CF Alpha (Equal-weighted)*, which is the difference between *Allocation Alpha* and the alpha of the equal-weighted counterfactual portfolio. The key explanatory variable, *Affiliated Advisor*, equals one if the advisor is affiliated with the plan's recordkeeper, and zero otherwise. All models include all additional explanatory variables. All variables are defined in Appendix I. Standard errors are clustered at the plan level and *t*-statistics are presented in parentheses. Significance at the 10%, 5%, and 1% levels is denoted by *, **, and ***, respectively.

	(1) Allocation Alpha	(2) CF Alpha (Value-weighted)	(3) CF Alpha (Equal-weighted)
Affiliated Advisor	-0.00263***	-0.0022***	-0.00227***
	(-4.56)	(-3.73)	(-3.78)
Unaffiliated Advisor	-0.00024	-0.00009	-0.0001
	(-0.75)	(-0.26)	(0.31)
N	88,186	88,186	88,186
Adj. R-sq.	0.784	0.302	0.279
Controls	YES	YES	YES
Plan FE	YES	YES	YES
Year FE	YES	YES	YES
Recordkeeper FE	YES	YES	YES

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