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# Generalists versus Specialists: Lifetime Work Experience and CEO Pay 

Finance Working Paper N ${ }^{\circ} 333 / 2012$
July 2012

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We thank for helpful comments an anonymous referee, Ilona Babenko, Jeff Coles, Alex Edmans, Carola Frydman, Charles Hadlock, Todd Milbourn, Kevin J. Murphy, Oguzhan Ozbas, Bill Schwert (the editor), Albert Sheen, Laura Starks, René Stulz, Marie Sushka, and Yuhai Xuan; participants at the 2011 SFS Finance Cavalcade and 2012 American Finance Association meetings; and seminar participants at Arizona State University, Nova School of Business and Economics, Ohio State University, and University of Oregon.
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## Abstract

We show that pay is higher for CEOs with general managerial skills gathered during lifetime work experience. We use CEOs' résumés of S\&P 1,500 firms from 1993 through 2007 to construct an index of general skills that are transferable across firms and industries. We estimate an annual pay premium for generalist CEOs-those with an index value above the median-of $19 \%$ relative to specialist CEOs, which represents nearly a million dollars per year. This relation is robust to the inclusion of firm- and CEO-level controls, including fixed effects. CEO pay increases the most when firms externally hire a new CEO and switch from a specialist to a generalist CEO. Furthermore, the pay premium is higher when CEOs are hired to perform complex tasks such as restructurings and acquisitions. Our findings provide direct evidence of the increased importance of general managerial skills over firm-specific human capital in the market for CEOs in the last decades.

Keywords: Executive compensation, Market for executives, Human capital
JEL Classifications: G34, J24, J33

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# Generalists versus Specialists: Lifetime Work Experience and CEO Pay* 

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#### Abstract

We show that pay is higher for CEOs with general managerial skills gathered during lifetime work experience. We use CEOs’ résumés of S\&P 1,500 firms from 1993 through 2007 to construct an index of general skills that are transferable across firms and industries. We estimate an annual pay premium for generalist CEOs-those with an index value above the median-of $19 \%$ relative to specialist CEOs, which represents nearly a million dollars per year. This relation is robust to the inclusion of firm- and CEO-level controls, including fixed effects. CEO pay increases the most when firms externally hire a new CEO and switch from a specialist to a generalist CEO. Furthermore, the pay premium is higher when CEOs are hired to perform complex tasks such as restructurings and acquisitions. Our findings provide direct evidence of the increased importance of general managerial skills over firm-specific human capital in the market for CEOs in the last decades.


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## 1. Introduction

Gabaix and Landier (2008), Tervio (2008), and Edmans, Gabaix, and Landier (2009) argue that the pay of Chief Executive Officers (CEOs) is determined in a competitive labor market between firms and CEOs. Market-based theories predict that CEOs with the ability to be more productive should earn higher pay. Yet ability is hard to observe, and there is little empirical evidence on its effect on CEO pay. In this paper, we analyze new data on CEOs’ lifetime work experience to study whether CEOs are paid a premium when they accumulate general managerial capital (i.e., not specific to any organization, and transferable across firms or industries), rather than firmspecific managerial capital (i.e., valuable only within an organization). ${ }^{1}$

Murphy and Zabojnik $(2004,2007)$ argue that general managerial skills have recently become more important than firm-specific skills in the case of the CEO function. This means more competition in the labor market and higher pay when CEOs capture these rents. We do not expect this to happen in the case of firm-specific human capital, as these skills cannot be applied elsewhere, so specialist executives have little bargaining power in the labor market. The empirical prediction is that CEOs with more general skills receive higher pay. There are also likely to be more outside hires than internal promotions, because the benefit of a better match between CEO and firm outweighs the cost of firm-specific capital that is lost. This implies that CEOs hired from outside the firm, especially generalist managers, will earn higher pay.

The increased importance of general skills could result from product market changes due to industry deregulation (Hubbard and Palia, 1995; and Cunat and Guadalupe, 2009a) or from

[^2]foreign competition (Cunat and Guadalupe, 2009b). Other forces could be changes in technology and management practices, which amplify the effect of CEO talent on firm value (Garicano and Rossi-Hansberg, 2006) and the need of CEOs to be involved in companies’ investor-relation efforts (Murphy and Zabojnik, 2007). ${ }^{2}$

We test whether the composition of managerial skills is a determinant of CEO pay. We construct a proxy for general managerial skills based on past work experience using a panel of the CEOs of S\&P 1,500 firms over 1993-2007. We use information on all of a CEO's past positions in other firms, including positions in non-S\&P 1,500 firms. The sample includes nearly 4,500 CEOs, whose résumés include a total of 32,500 different past positions.

Our measure of general managerial skills considers five aspects of a CEO's professional career: past number of (1) positions, (2) firms, and (3) industries in which a CEO worked; (4) whether the CEO held a CEO position at a different company; and (5) whether the CEO worked for a conglomerate. The index of general managerial ability is the first factor of the principal components analysis of the five proxies, which is a linear combination of the proxies with more weight given to those that more accurately reflect a CEO's general skills. The index summarizes information on a CEO's general skills and allows us to classify a CEO as a generalist or a specialist. This approach minimizes measurement error and increases the power of the regression tests by avoiding multicollinearity from using the five proxies individually.

We find that the average general ability index has risen over the last 15 years and that it is positively and significantly associated with total CEO pay. The effect is economically important. A one-standard deviation increase in the index of general managerial ability is associated with an

[^3]additional $12 \%$ in annual total CEO pay. Moreover, generalist CEOs (those with a general ability index value above the median) earn a premium of $19 \%$ in annual pay, or nearly a million dollars in extra pay per year on average. The generalist pay premium is pervasive across industries but it is higher in industries that have experienced regulatory and technological shocks in the last two decades such as the telecom sector. We also find that the positive relation between pay and general managerial ability holds for each individual component of the index and for both cashand equity-based pay.

We control for many firm characteristics and CEO characteristics in our tests, including CEO age, tenure, and educational background. The results are robust to the inclusion of firm and CEO fixed effects, which control for time-invariant unobserved firm and CEO heterogeneity. We also address the endogeneity of CEO selection, which is the concern that the general managerial skills premium is due to non-random assignment of CEOs to firms. In order to address this possibility, we choose a control group of specialist CEOs using a propensity score matching procedure to ensure that there are virtually no observable differences in firm and CEO characteristics between the specialists CEOs and those in the treated sample of generalist CEOs. This method gives estimates of the generalist pay premium that are in line with the baseline regression estimates.

We also test whether CEOs with general managerial skills get higher market pay when they change jobs by examining a sample of newly appointed CEOs. We find an increase in CEO pay when a firm switches from a specialist to a generalist CEO, especially when a new CEO is hired from outside the firm. This is direct evidence that general managerial human capital commands a premium in the CEO labor market at the time a new compensation package is set.

Finally, we offer insights on why firms pay a significant wage premium to generalist CEOs. The generalist pay premium is higher when CEOs are hired to perform tasks such as
restructurings and acquisitions, which implies adapting to an evolving business environment. Indeed, the generalist pay premium is higher in firms operating in industries hit by shocks, distressed firms, and firms with intense mergers and acquisitions activity. These findings provide insights into why the labor market pays generalists at a premium.

There are several alternative interpretations for a positive relation between CEO pay and general managerial skills. A first hypothesis is that our index is simply capturing talent. Gabaix and Landier (2008) emphasize that the relation between CEO pay and firm size is consistent with assortative matching of top talent to large firms. We address this possibility in several ways. We show that the findings are robust to the inclusion of CEO fixed effects, which control for unobserved time-invariant CEO heterogeneity such as innate talent. We show that the relation between pay and general skills is pervasive across different-sized firms, indicating that it is not stronger for larger firms that attract top talent. And the results are robust when we control directly for proxies of CEO innate talent such as age of first appointment to CEO, selectiveness of the CEO's college, and job market conditions at the time of graduation from college.

A second alternative hypothesis is rent extraction by powerful CEOs who grant themselves excessive pay packages (Bebchuk, Fried, and Walker, 2002). CEOs with more accumulated experience are likely to be better at extracting rents. This hypothesis predicts that the generalist CEO pay premium would be higher in weaker governance firms. We find that the generalist pay premium is robust to controls for internal and external corporate governance, and that general skills are equally important for the CEO pay of firms with weak and strong corporate governance.

A third alternative hypothesis is that risk-averse CEOs may chose different career paths. A CEO that is more risk averse might choose a more diversified professional career by working in different firms and industries. The finding that the generalist pay premium is important for both
cash and equity pay does not seem to support the risk-aversion hypothesis. Furthermore, a riskaverse CEOs should demand a pay premium for accepting the increased risk of equity-based pay (e.g., Hall and Murphy, 2002; Conyon, Core and Guay, 2011; and Edmans and Gabaix, 2011). We still find a significant generalist pay premium after we control directly for the risk of compensation using the pay mix.

A final alternative hypothesis is that generalist CEOs are more high profile and attract more attention from boards (Malmendier and Tate, 2009). Generalists could also be "serial CEOs" who engage in job hopping (Giannetti, 2011) and feature more prominently in databases of executive search firms and have an easier time being recruited (Dasgupta and Ding, 2010). In these cases, CEOs could just have temporary luck, but their performance would ultimately be disappointing. We investigate this possibility and do not find a significant relation between firm performance and the general ability index. Additionally, we find that generalist CEOs are not at any greater risk of termination following poor firm performance.

Taken altogether, the results are consistent with an efficient market-based explanation of the pay premium awarded to CEOs with more general managerial skills. The relation between CEO pay and general managerial skills is consistent with optimal contracting and the view that compensation decisions by boards are based on candidate merits.

Our study complements previous findings that CEO skill set is an important determinant of CEO pay. Coles and Li (2010) and Graham, Li, and Qiu (2012) find that manager fixed effects explain a large part of the variation in executive pay. Fee and Hadlock (2003) use prior stock price performance as a proxy for managerial ability and find that CEOs in firms with aboveaverage performance are more likely to be hired by other firms and receive higher pay at the new firm. Falato, Li, and Milbourn (2011) find that CEO talent (proxied by media coverage, age at
which an executive becomes a CEO, and educational background) is an important determinant of pay. ${ }^{3}$ We complement this work by measuring skills acquired during an executive professional career and showing that these skills help to explain CEO pay. ${ }^{4}$

Our work also adds to the empirical evidence of Murphy and Zabojnik (2007) and Frydman (2009) that CEO pay is determined in a competitive labor market of firms and CEOs, and that CEO pay has increased in the last decades because conditions in the market have changed in the direction of emphasizing general skills. Murphy and Zabojnik (2007) provide indirect evidence by examining the relation between outside hiring and CEO pay. Frydman (2009) measures the generality of human capital by looking at occupational mobility within a firm (i.e., number of organizational areas where an executive worked such as production or sales) and educational background in a sample of the top-50 firms. Our measure of general ability focuses instead on mobility across industries and firms (as well as experience as a top manager and in a diversified firm) rather than internal mobility within a firm. Our focus on external mobility is important because of the time trend observed in the labor market of appointing CEOs through external hiring rather than internal promotion.

## 2. Sample and data description

Our initial sample consists of a panel of 25,562 CEO-firm-years in the 1993-2007 period drawn from the Execucomp database. We manually match the executives in Execucomp who are

[^4]identified as CEOs in a specific year with profiles in the BoardEx database in order to have data on their characteristics including all prior professional experience (whatever the position or firm). We could not find a match in BoardEx for 1,024 CEOs in our initial sample as there is some survivorship bias in BoardEx, which affects primarily the match with Execucomp in the first years of the sample period. The percentage of CEOs in Execucomp whose profiles are in BoardEx grows from about $80 \%$ in the 1993-1999 period to more than $90 \%$ in the 2000-2007 period. ${ }^{5}$ The final sample includes 21,909 CEO-firm-year observations and 4,451 different CEOs.

We match firms in BoardEx to Compustat (US firms) and Datastream (international firms) in order to obtain the standard industrial classification (SIC) of firms where CEOs worked. Because Compustat and Datastream include only publicly traded firms, our analysis is restricted to past positions in these firms. The sample of past positions includes 32,500 observations.

### 2.1. Measuring general managerial ability and CEO pay

Our goal is to test whether a generalist CEO is paid at a premium over a specialist CEO with otherwise similar characteristics who is at a similar firm. To do this we create an index of the generality of the CEO's human capital (general ability index) based on the CEO's lifetime work experience in publicly traded firms prior to his current CEO position. This index captures the skills of the CEO that are transferrable across firms and industries, rather than firm-specific. We consider five proxies of general managerial ability:

Number of Positions (X1): Number of different positions that a CEO performed during his career. A CEO with more positions is likely to have been exposed to different organizational areas such as production, finance, human resources, sales, and marketing.

[^5]Number of Firms (X2): Number of firms where a CEO worked. A CEO who worked for multiple firms has probably acquired more generic skills as opposed to firm-specific skills.

Number of Industries (X3): Number of industries at the four-digit SIC level where a CEO worked. A CEO who worked for firms in different industries has been exposed to different business environments. ${ }^{6}$

CEO Experience Dummy (X4): Dummy variable that equals one if a CEO held a CEO position at another firm. A CEO position requires by definition a set of generic skills in order to deal with different organizational areas, and also to deal with the many external entities such as capital markets, stakeholders, and media.

Conglomerate Experience Dummy (X5): Dummy variable that equals one if a CEO worked for a multi-division firm. A CEO who has worked for a conglomerate has been exposed to a more complex organization and likely has more attractive outside options. Lazear (2009) develops a theory that firms vary in their weighting of different skills. This view suggests that a diversified firm puts non-zero weights on skills applicable across the industries in which the firm operates. Tate and Yang (2011) show that workers who move from diversified firms face better outcomes in the labor market.

To combine these variables into a one-dimensional index of general managerial ability, we extract common components, using principal component analysis, from the five variables that proxy for general human capital. Using a single factor, instead of the five variables individually, we increase the power of the regression tests by avoiding the problems arising from multicollinearity and minimize measurement error.

[^6]Table 1 shows the results of the principal component analysis for the proxies of general managerial ability. Using this methodology we obtain only one component with an eigenvalue higher than one (eigenvalue of 2.984). ${ }^{7}$ As expected, all the five variables have positive loadings, being positively correlated with the index. Thus, higher levels of general human capital are reflected in a higher value of the index. The index gives close to equal weights to the past number of positions, firms, and industries, and a lower weight to the past CEO and conglomerate experiences. The general ability index (GAI) of CEO $i$ in year $t$ is calculated by applying the scores in Table 1 to the standardized general ability components; the index is standardized to have zero mean and a standard deviation of one: ${ }^{8}$

$$
\begin{equation*}
G A I_{\mathrm{i}, \mathrm{t}}=0.268 X 1_{\mathrm{i}, \mathrm{t}}+0.312 X 2_{\mathrm{i}, \mathrm{t}}+0.309 X 3_{\mathrm{i}, \mathrm{t}}+0.218 X 4_{\mathrm{i}, \mathrm{t}}+0.153 X 5_{\mathrm{i}, \mathrm{t}} \tag{1}
\end{equation*}
$$

Figure 1 and Panel A of Table 2 show a shift in the relative importance of general versus firm-specific managerial skills; the general ability index increases over time. This is consistent with the idea that CEOs have more general skills that are transferable across firms and industries.

Figure 1 and Panel A of Table 2 also report the time series of average CEO total pay in the 1993-2007 period. Total pay consists of salary, bonus, value of restricted stock granted, value of options granted, long-term incentive payout, and other compensation (Execucomp item TDC1). We observe a significant increase in average total pay, consistent with findings in Piketty and Saez (2003), Frydman and Jenter (2010) and Murphy (2012). Average total pay more than doubles from 1993 to 2000, but then stays fairly stable at about $\$ 5$ million.

Using the general ability index, we classify CEOs with an index above the yearly median as

[^7]generalists and CEOs with an index below the yearly median as specialists. ${ }^{9}$ We then calculate the average total pay of each type of CEO in each year. We find that generalists are paid at a premium over specialists in every year. The premium increases over the 1990s, reaching a peak of $\$ 3.4$ million in 2000. Then there is a decline over the 2000s, but the premium stays above $\$ 2.3$ million in every single year.

We also develop a new measure-Generalist Excess Pay-that aims to capture the pay premium of a multi-industry CEO (an executive who worked in several industries) when matched to an equivalent portfolio of single-industry CEOs (i.e., an executive who worked only in that industry). The portfolio of specialists aims to match the set of skills that the multi-industry CEO acquired during his career. This measure is inspired by the excess value measure used in the corporate diversification literature (Berger and Ofek, 1995).

The generalist excess pay is computed as the difference between CEO total and imputed pay, where the latter is the average CEO pay of the industries where the CEO worked. The industrylevel pay is given by the median pay of single-industry CEOs. The industry match is at the fourdigit SIC code level when there are five or more single-industry CEOs or at the highest SIC level with at least five single-industry CEOs. Panel A of Table 2 shows a significant increase in the generalist excess pay measure over the period. Because the average generalist excess pay is always positive over time, we conclude that multi-industry CEOs are paid at a premium. ${ }^{10}$

[^8]
### 2.2. Cross-industry variation

We find significant variation across industries (Fama-French 12 industry groups) in terms of the general ability index as well as in terms of the difference in pay between generalist and specialist CEOs. Panel B of Table 2 shows that the telecom (telephone and television industry) industry has the highest average level of generality of CEO human capital (0.472) and at the same time is also the industry whose CEOs are the highest paid on average ( $\$ 9$ million). Further, CEOs of telecom firms with résumés that include positions in other industries receive on average $\$ 7.7$ million more than CEOs who have spent all their careers in the telecom industry. Over the 1990s, the telecom industry changed rapidly not only because of technological innovation (cell phones, internet), but also in terms of regulation following the Telecommunications Act in 1996. This could have increased the demand for managers with more general skills. The industry with the lowest general managerial skills index is finance ( -0.228 ), but we still find a significant premium in generalists’ pay in this industry. Overall, there is a positive and significant generalist pay premium and generalist excess pay measure across all industries.

A good example of a generalist executive is Michael H. Jordan who has the fifth highest general ability index (5.866 as of 2007). He served as Division Chairman/CEO of PepsiCo (consumer nondurables industry) in 1986-1990, and as CEO of Westinghouse Electric (manufacturing industry) in 1993-1998, CBS (telephone and television industry) in 1995-1998, and Electronic Data Systems (business equipment industry) in 2003-2007. In addition, he had several other positions in companies operating in other industries such as consumer nondurables and wholesale and retail industries. His total compensation was $\$ 3.1$ million in 1997 (the year before he left CBS) and nearly five times higher at $\$ 14.9$ million in 2004 (the year after he joined Electronic Data Systems). He was paid an average premium of $\$ 10$ million over the average pay
of specialist (single-industry) CEOs while he was the CEO of Electronic Data Systems.
Other examples of generalist executives (from the list of CEOs whose index is above the 90th percentile) include Robert S. Miller Jr. (the second highest index with 6.868 as of 2007) who served as CEO of Delphi (2005-2007), Gerald Grinstein who served as CEO of Delta Air Lines (2004-2007), and Ivan Seidenberg who served as CEO of Verizon Communications (20032011).

Examples of specialist executives (from the list of CEOs whose index is below the 10th percentile) include Michael Dell who is the founder and CEO of Dell since 1984, John Mackey who is the founder and CEO of Whole Foods Market since 1980, Robert Selander who served as CEO of Mastercard (1997-2010), and James Skinner who served as CEO of McDonald's since 2004. These specialists have spent their entire professional careers in a single firm or industry.

The succession planning prior to Jack Welch's retirement as Chairman and CEO of General Electric (manufacturing industry) is also a good example of how general managerial abilities, in particular experience at a conglomerate, could matter for CEO pay. James McNerney, Robert Nardelli, and Jeffrey Immelt were the three potential successors who competed to succeed Welch. Immelt was selected for the job, but all three ended up receiving a pay premium in the labor market. Immelt, who made $\$ 23$ million in 2002 at General Electric, has been quite successful as CEO. McNerney made $\$ 12$ million in 2002 at 3M (manufacturing industry) and, after a good job as CEO at 3M, went to Boeing (manufacturing industry) as CEO. Nardelli made $\$ 35$ million in 2002 at Home Depot (wholesale and retail industry), but the company lagged in performance, with a stock price performance significantly behind its peers. Interestingly, the manufacturing industry is above the median in terms of the general ability index, while the wholesale and retail industry is the second-lowest in terms of the general ability index. Thus, Nardelli's general skills
were a bad match for Home Depot, while McNerney's were a good match for 3M.

### 2.3. Summary statistics of CEO and firm characteristics

Table 3 shows summary statistics for CEO pay, CEO characteristics, and firm characteristics. Besides the CEO attributes in the general ability index, we measure some additional CEO characteristics: CEO Age, CEO Tenure, External Hire Dummy, MBA Dummy, CEO-Chair Dummy, First Year as CEO Dummy, Ivy League Dummy, Recession Graduate Dummy, and Fast Track Career. We also control in the tests for firm characteristics: Sales, Tobin's $Q, R O A$, Volatility, Stock Return, Firm Age, and Diversification Dummy. All variables are winsorized at the 1th and 99th percentile values. Table A. 1 in the Appendix provides variable definitions and data sources.

### 2.4. General managerial ability and CEO and firm characteristics

Which firms are more likely to have a generalist CEO? Table 4 shows the average CEO and firm characteristics for generalist and specialist CEOs. Table 4 also presents correlation coefficients between the general ability index and firm and CEO characteristics. CEOs with more accumulated general human capital tend to be older, appointed from outside the firm, hold an MBA degree, and have a shorter tenure than specialist CEOs. As expected, we find that firms with generalist CEOs are bigger, older, and more diversified. We also find that firms with generalist CEOs have higher leverage and lower cash holdings and stock return volatility. The differences in firm performance are small, even though statistically significant. Accounting performance and stock market performance are slightly higher for firms with specialist CEOs. The differences in Tobin's Q, CAPEX, and R\&D are not economically meaningful.

## 3. Do generalist CEOs get paid more?

In this section, we examine the relation between CEO pay and the generality of his managerial ability based on past work experience using regression tests.

### 3.1. Baseline regressions

Table 5 presents our main test of whether CEOs with higher general managerial ability receive higher pay. The base specification is an ordinary least squares (OLS) panel regression where the dependent variable is the logarithm of CEO total pay. The regressions include both year and industry (two-digit SIC) fixed effects, and the t-statistics are adjusted for heteroskedasticity and within-firm correlation using clustered standard errors. ${ }^{11}$

We also estimate firm and CEO fixed effects panel regressions. Fixed-effects methods solve "joint determination" problems in which an unobserved time-invariant variable simultaneously determines total pay and the general ability index. In firm fixed-effect regressions, only the effects of within-firm changes in total pay are taken into account, so firm-specific omitted variables cannot explain the observed relation between pay and managerial attributes. The CEO fixed-effects regression solves the equivalent problem at the CEO level; that is, it controls for CEO characteristics that are innate, such as CEO talent or CEO risk aversion. In the CEO fixedeffects regression, the coefficient of the generalist ability index dummy captures only the difference in pay for CEOs who change from specialist to generalist or vice-versa. ${ }^{12}$

Column (1) presents the estimates of an OLS regression of CEO total pay on firm

[^9]characteristics, while column (2) presents the estimates of an OLS regression of CEO total pay on firm and CEO characteristics, but without including the general ability index. The coefficients of the firm and CEO characteristics are consistent with other studies of the determinants of CEO pay. We find that firm size is positively associated with total pay, which is consistent with findings in Gabaix and Landier (2008) and others. Examination of other commonly used firmlevel factors affecting CEO pay indicates that pay is positively associated with growth opportunities (Tobin’s Q), firm performance as measured by stock returns, and stock return volatility. In terms of CEO characteristics, we find a pay premium for CEOs with an MBA (this variable is dropped in the CEO fixed-effects specification because CEOs with an MBA degree got it before their first CEO position), CEOs who are also chair of the board, and those in the first year of CEO appointment (which might reflect a signing bonus effect). The R-squared is $47.7 \%$ in column (1) and $49.3 \%$ in column (2), which is in line with other studies of the determinants of CEO pay.

Columns (3)-(5) of Table 5 show that the coefficient on the general ability index is positive and significant in all specifications, which is consistent with the idea that CEOs with more general managerial skills earn a wage premium. Using the estimates in column (3), CEOs who are one-standard deviation higher in the general ability index distribution earn $12 \%$ higher in annual total pay, which corresponds to approximately half a million dollars of extra pay per year.

The general ability index is correlated with some of the firm and CEO characteristics, so there is a concern that multicollinearity may be driving the results. When we run the regressions in Table 5 using the general ability index as the only explanatory variable (untabulated), we find that the index coefficient is positive and significant. Additionally, we find that the inclusion of the general ability index does not significantly affect the coefficients of the other control
variables relative to the regressions using only the control variables in columns (1) and (2).
So far we have treated the general ability index as a continuous variable. An alternative approach is to classify CEOs as generalists versus specialists according to the distribution of the general ability index in each year. In this case, we define a general ability index dummy variable that takes a value of one for CEO-year observations with an index above the yearly median, and zero otherwise. In columns (6)-(8) of Table 5 we present the results of the total pay regressions after replacing the general ability index with this dummy. The results are robust across the different specifications and are consistent with those using a continuous variable. We see that the general ability index dummy coefficient is positive and significant, indicating that generalist CEOs earn a wage premium. A generalist CEO earns about 19\% more than a specialist CEO, which in dollar terms is about $\$ 850,000$ per year.

In Table 6 we examine the effect of the general ability index on each pay component: cash pay (salary plus bonus) in columns (1)-(3) and equity pay (restricted stock plus option awards) in columns (4)-(6). We find a positive relation between the general ability index and cash and equity pay, but a stronger effect in equity pay. In columns (1) and (4), a one-standard deviation increase in the index is associated with an increase of $4 \%$ in cash pay and $16 \%$ in equity pay. When we use the general ability index dummy as an explanatory variable (untabulated), we find that the cash and equity pay are $5 \%$ and $23 \%$ higher for generalist CEOs than specialist CEOs. In the CEO fixed-effects specification for equity pay in column (6), the coefficient is not statistically significant although it is similar in size to the firm fixed-effects estimates in column (5). This is probably due to lower within-CEO variation and a smaller number of observations in the case of equity pay.

Columns (7)-(9) test the sensitivity of the results to the inclusion of the pay mix (ratio of
equity pay to total pay) as an economic determinant of CEO total pay. The pay mix is included as a determinant of pay levels to see whether controlling for compensation risk significantly affects our results. If firms provide more incentives to generalist CEOs through equity pay, it is possible that the generalist pay premium is a result of risk-averse CEOs demanding a pay premium for accepting the increased risk of equity pay. We still find a positive and significant general ability index coefficient when we include the pay mix as an explanatory variable. The magnitude of the coefficients is reduced relative to those in Table 5 but the effect is still economically important. Using the estimates in column (7), CEOs who are one-standard deviation higher in the general ability index distribution earn 7\% higher annual total pay.

In order to further examine this issue, we use the pay mix as the dependent variable to examine the relation with general managerial skills. Column (10) presents the results of a Tobit model for the ratio of equity pay to total pay. We also find that general ability index is positively associated with the ratio of equity pay to total pay.

The pay components and mix results are informative about the alternative hypothesis that risk-averse CEOs may choose a more diversified professional career by working in different firms and industries or demanding a pay premium for accepting the increased risk of equity pay. The finding that the generalist pay premium is important for both cash and equity pay does not seem to support the risk-aversion story. A risk-averse CEO would not value cash and equity pay equally. Furthermore, the finding of significant generalist pay premium when we control for the risk of pay does not support the risk-aversion story.

Table 7 presents estimates of the same regressions as those in Table 5 but now using the five individual measures of general skills instead of the general ability index as main explanatory variables. We find that all index components are positively associated with total pay. These
findings support the hypothesis that greater mobility of CEOs across positions, firms, and industries and prior experience as CEO and in conglomerates carry a positive pay premium. The effects are economically important. For example, columns (3) and (5) show that one extra firm or industry in a CEO's résumé adds an extra 6\% to annual total pay.

### 3.2. Sample selection bias

One important concern with our findings of a general managerial ability pay premium is sample selection bias due to endogeneity in the assignment of CEOs to firms. The main concern with the endogenous matching of CEOs to firms is that the generalist pay premium is in reality driven by some unobserved firm and/or CEO characteristic that is correlated with the general ability index. If matching is based only on observable firm and CEO characteristics and time-invariant effects, the firm and CEO fixed effects regressions address the matching problem. In other words, fixed effects control for time-invariant factors that affect managers' choice of firm or firm's choice of manager. However, if managers and firms are matched based on unobserved time-variant firm or manager characteristics, then fixed effects cannot fully address the matching problem (e.g., Abowd, Kramarz, and Margolis, 1999; and Bertrand and Schoar, 2003). For example, a selection story would attribute the generalist pay premium to the fact that generalist CEOs are disproportionally assigned to large firms.

We use a nearest-neighbor matching estimator (Abadie and Imbens, 2011) to address selection concerns. Ideally, we would like to compare the CEO pay of a firm that appoints a generalist CEO to the same firm's pay if it had appointed a specialist CEO. As we cannot observe the counter-factual, we construct a hypothetical one by estimating a first-stage probit regression of the likelihood that a firm appoints a generalist CEO (i.e., those with a general
ability index above the yearly median) using observable pre-transition firm and CEO characteristics related to the CEO selection. CEO selection is a natural application for a matching procedure as selection decisions are made by directors who rely mostly on public information to assess CEO ability.

Research has found that one signal that boards rely on in choosing external CEO candidates is performance of the candidate's current firm. Boards are more likely to hire executives from high-performing firms, and boards pay a premium for this performance (Fee and Hadlock, 2003). ${ }^{13}$ The first-stage probit model estimates (untabulated) show a greater likelihood of appointing a generalist CEO in larger firms, conglomerates, more levered firms, and R\&Dintensive firms. There is a negative and significant relation between pre-transition firm accounting performance and the likelihood of appointing a generalist CEO.

We find that the total pay difference between generalist CEOs (the treatment group) and the matched specialist CEOs with the closest predicted probability (the control group) is $18 \%$, which is statistically significant and similar in size to our baseline regression results in Table 5. Estimates of the cash pay and equity pay premiums here are also in line with the estimates in Table 6. Overall, this evidence suggests that the endogeneity of CEO selection is unlikely to be driving our primary findings. In the next section, we further address endogeneity concerns.

### 3.3. CEO appointments and switch types

We now consider only newly appointed CEOs whose lifetime work experience is more likely to be a valuable signal of general ability, as they do not have a track record at their new job. Appointment-year pay should also be closest to pay set in the labor market. In this sample of

[^10]newly appointed CEOs we expect to find an increase in pay when a firm appoints a CEO with greater general managerial ability. We use pay measured in the year of the CEO appointment. ${ }^{14}$

Panel A of Table 8 shows a positive and significant link between total pay and the general ability index in the sample of newly appointed CEOs. A one-standard deviation increase in the general ability index is associated with a $12 \%$ increase in total pay per year, which is similar to the estimates in Table 5. Again, this effect comes predominantly from the equity pay component.

The ideal experiment to address selection concerns would be to replace (exogenously) a generalist CEO with a specialist CEO (or vice versa) and observe the change in pay. If there was no change in pay then we would conclude that CEO pay is not linked to general managerial ability, but generated by some unobservable characteristic. Unfortunately this experiment cannot be implemented in practice. The closest we get is by looking at switches of CEO type. Of course in this case, the decision to replace the CEO and the selection of the new CEO is not exogenous.

We examine the effect on pay when a firm switches CEO type from generalist to specialist or vice-versa. We classify CEOs as generalists (specialists) if their general ability index is above (below) the 75th percentile in each year. We expect firms to offer a pay premium when they switch from a specialist to a generalist CEO. The effect should be more pronounced when the new CEO is hired from outside the firm because the firm is accessing the CEO labor market (Murphy and Zabojnik, 2004, 2007).

We measure the switch of CEO type using variables as follows: (1) No Switch of CEO Type, a dummy that equals one if there is a new CEO at year $t$ but there is no switch of CEO type from $t$ - 1 to $t$; (2) Switch to Generalist - External Hire, a dummy that equals one if there is a generalist CEO hired from outside the firm at year $t$ who follows a specialist CEO; (3) Switch to

[^11]Specialist - External Hire, a dummy that equals one if there is a specialist CEO hired from outside the firm at year $t$ who follows a generalist CEO; and similarly (4) Switch to Generalist Internal Hire and (5) Switch to Specialist - Internal Hire, for the case of internally appointed CEOs. We estimate these coefficients using the panel of firms-CEOs, and therefore the intercept in the regression captures the base case of no CEO turnover.

Column (1) of Table 8, Panel B, shows that the coefficient on Switch to Generalist - External Hire is positive and significant, while the coefficient on Switch to Specialist - External Hire is negative although statistically insignificant. Moreover, these two coefficients are statistically different from each other as shown by the F-statistic at the bottom of the table. The effect on CEO total pay of switching from a specialist to a generalist CEO by external appointment is economically important at about 27\% extra pay, which corresponds to $\$ 1.2$ million per year. Columns (2) and (3) show that the increase in pay associated with switching from a specialist to a generalist CEO is driven by an increase in equity pay of more than $40 \%$, while there is a reduction in cash pay (although not statistically significant). For internally appointed CEOs, there is some evidence of a pay discount when a specialist is appointed.

Overall, there is an increase in CEO pay when a specialist is replaced by a generalist, especially when the CEO is hired from outside the firm. This is evidence that general managerial human capital commands a pay premium in the CEO labor market. Furthermore, there is no indication that matching explains the generalist pay premium although we cannot completely rule out the possibility that some time-variant unobserved characteristic explains our findings.

### 3.4. Is general managerial ability capturing talent?

Another concern with the measure of general managerial ability is that it may be capturing a

CEO's innate talent rather than accumulated skills. Talented CEOs may move more across firms and industries. In this case, the observed generalist premium would represent a reward for talent. The CEO fixed-effects regressions in Tables 5 and 6 address this concern to the extent that they control for unobserved time-invariant heterogeneity across CEOs.

To further address the talent hypothesis, we run additional tests using proxies for CEO talent. Ivy League Dummy is a variable that takes a value of one if the CEO attended an Ivy League school at any academic level. Falato, Li, and Milbourn (2011) suggest that CEOs educated at more selective institutions are paid at a premium, and this effect is associated with talent. The second proxy of CEO talent is the Recession Graduate Dummy, which is a variable that takes a value of one if the CEO's first academic degree was awarded in an NBER recession year. Conditional on having become a CEO, managers who started their careers under tougher labor market conditions should be more talented than other managers. Oyer (2008) show that the labor market consequences of completing an MBA in a bad economy are negative and persistent, and Schoar and Zuo (2011) show that economic conditions at the beginning of a managers’ career have lasting effects on his career path. The third proxy is the Fast Track Career, which is the age at which a manager became CEO for the first time. Falato, Li, and Milbourn (2011) suggest that executives who are appointed CEOs earlier in their careers have greater talent and are expected to be paid a premium.

Column (1) of Table 9, Panel A, shows a generalist pay premium of approximately 12\%, which is similar to what we see in Table 5, even after controlling for different proxies for CEO talent. Talent proxies coefficients have the expected sign but they are not statistically significant across all specifications. In columns (3)-(6) we find a generalist pay premium using both cash and equity pay but the equity pay premium is higher than the cash pay premium. Fixed effects
estimates are also consistent with the estimates in Table 5.
In an additional check, we test whether a CEO general ability index as of 2007 predicts CEO average pay in the 1990s (1993-1999, specifically). If this is the case, then the index may well be capturing CEO innate skills. Panel B of Table 9 shows that the general ability index of 2007 does not significantly predict CEO pay in the earlier period. We conclude that the general ability index is thus capturing accumulated skills and not just CEO innate talent.

### 3.5. Cross-sectional variation in the generalist pay premium

Next we investigate whether the relation between general managerial attributes and CEO pay is heterogeneous across different types of firms. We first study the size of a firm's operations because that has been shown to be an important determinant of CEO pay, as more talented CEOs are matched to larger firms (Gabaix and Landier, 2008). We then study the effect of corporate diversification. Both firm size and number of business segments have been used as proxies for the scope and complexity of a firm’s operations (e.g., Boone, Field, Karpoff, and Raheja, 2007; and Coles, Daniel, and Naveen, 2008).

Panel A of Table 10 presents regressions of CEO total pay for groups of firms according to firm size and number of business segments. Columns (1)-(4) present results for the sample split into small and large firms based on sales below or above the yearly median. There is a positive relation between total pay and the general ability index in both the small and large firm groups. We conclude that our primary findings are not exclusively driven by large firms. To the extent that we find a CEO pay-general ability premium of the same magnitude in small and large firms, there is no indication that the general ability index is just a proxy for talent.

Columns (5)-(8) present results for firms with a single business segment (stand-alone firms)
and multiple business segments (diversified firms). We find a positive coefficient only in the sample of diversified firms. This finding is consistent with the idea that diversified firms have more need of general skills and pay a higher premium for managers with such skills. Generalist CEOs have the abilities required to manage a firm that operates in different business environments, and these firms seem to reward these managers with extra pay. ${ }^{15}$

Finally, we examine how the quality of a firm's internal and external corporate governance affects the CEO pay-general ability relation. Panels B and C of Table 10 present regressions for groups of firms depending on the fraction of independent directors on the board of directors (Board Independence), concentration of institutional ownership (Institutional Ownership Herfindahl), takeover defenses (Gompers, Ishii and Metrick, 2003; GIM governance index), and product market competition (Industry Sales Herfindahl). We rank firms into groups according to the median of the distribution of these variables. ${ }^{16}$

High board independence and institutional ownership Herfindahl index are associated with better corporate governance and more effective monitoring of management actions (Weisbach, 1988; and Hartzell and Starks, 2003). In Panel B we find that the pay-general ability relation is important in groups of both low and high internal corporate governance. The relation is slightly stronger in the low corporate governance groups, but the difference between the high and low groups is not statistically significant.

In Panel C we find that the pay-general ability relation is important both in the groups of low and high external governance in terms of the governance index and product market competition.

[^12]There is some evidence that the relation is stronger for firms with fewer takeover defenses but only in the fixed-effects models. In untabulated regressions, we also find that estimates of the general ability index coefficient are barely affected by including the measures of corporate governance directly as control variables in the regressions in Tables 5 and 6.

We conclude that the effect of general managerial ability is pervasive across firms with different corporate governance mechanisms. If general managerial attributes are proxies for CEO power to set their own pay (Bebchuk, Fried, and Walker, 2002), then pay for general skills would be a reflection of entrenchment issues, and we should see significantly higher premiums for firms with weaker governance, such as lax board monitoring. If general skills are to the contrary signals of productive ability that are useful to executives in competitive labor markets, we should see similar (or even higher) premiums in better-governed firms than in more-poorly governed firms. Overall, the results are inconsistent with an entrenchment view explaining the generalist CEO pay premium.

### 3.6. Effect of firm performance and industry shocks

Generalist CEOs might be particularly important at the time of shocks to the firm and they might be hired to perform difficult tasks such as restructurings and acquisitions. This could be one reason why firms are willing to pay generalist CEOs a premium over specialists. We run tests to investigate this possibility in the sample of newly appointed CEOs, as this is the time there should be a stronger link between the CEO pay package and the type of task an executive is hired to perform.

We first consider the possibility that generalist CEOs are hired and paid a premium when the firm is in distress. We classify a firm as in Distress if in a given year its return on assets is below
the industry median (two-digit SIC) for two consecutive years. All other firms are classified as in No Distress. Columns (1) and (2) of Table 11 present the results. We find a significantly stronger positive relation between pay and general managerial ability in the sample of distressed firms.

Mergers and acquisitions (M\&A) could represent another important setting where there may be strong demand for CEOs with general skills. If this is the case, we should see that the pay premium is more pronounced in situations with high M\&A activity. We classify a firm as High $M \& A$ Activity if in a given year it has a value of acquisitions in the top quartile of the distribution of acquisitions across all firms. All other observations are classified as Low M\&A Activity. Columns (3) and (4) of Table 11 show a more pronounced positive relation between CEO pay and general managerial ability in the sample of firms that make more acquisitions.

Finally, firms operating in industries hit by shocks (technological changes or other factors) may hire a generalist CEO for restructuring or adapting to an evolving business environment, and be willing to pay a significant wage premium. We test for this possibility by classifying an industry as High Industry Shocks if in a given year it is in the top quartile of the distribution of the difference between industry sales growth and the average sales growth across all industries. An industry is classified as Low Industry Shocks if in a given year it is in the bottom quartile of the distribution. This definition follows Mitchell and Mulherin (1996). In columns (5) and (6) of Table 11, we find that the positive relation between pay and general managerial ability is statistically significantly only for firms operating in industries facing shocks.

### 3.7. Generalist CEO excess pay

A different measure of the pay premium to generalist CEOs is defined as the difference between a CEO's total pay and the imputed pay, given the executive's past industry experience measured
by the pay of single-industry CEOs (i.e., the pay of CEOs who worked only in one industry over their careers at the four-digit SIC code level). The Generalist Excess Pay is the logarithm of the ratio of a CEO's total pay to imputed pay; i.e., the premium or discount in pay resulting from industry mobility. ${ }^{17}$ This measure produces a better match between the compensation of a CEO with more general skills (generalists) and specialist CEOs in terms of industry experience.

Table 12 presents the results of regressions where the dependent variable is the Generalist Excess Pay variable. We control for the same set of firm and CEO characteristics (coefficients not shown) used in Table 5. We use the past number of industries or the multi-industry dummy as explanatory variables because they naturally match the definition of the dependent variable. The coefficient on the multi-industry dummy captures the percentage difference in average excess pay between CEOs with a career path across more than one industry (multi-industry) and single-industry CEOs. The pay premium for multi-industry CEOs is more than $14 \%$ in the OLS specification in column (3).

In columns (5)-(8) we also estimate the excess pay regressions using as main explanatory variables the general ability index and the general ability index dummy. There is strong evidence of a positive relation between excess pay and general managerial attributes. A one-standard deviation increase in the index is associated with $11 \%$ higher generalist CEO excess pay using the specification in column (5).

Overall, the results using the excess pay measure support the notion that CEOs with more general managerial skills earn a significant wage premium in the labor market. In particular, CEO pay is higher for executives who have worked in more than one industry, and therefore

[^13]there is evidence of an industry mobility wage premium.

### 3.8. Other robustness checks

We perform several other robustness checks of our primary findings. In the interest of conserving space, we do not tabulate these additional tests.

The general ability index is constructed using five proxies for general managerial ability. There is a concern that the number of positions and firms does not capture acquisition of general skills, as it may reflect simply intra- and inter-firm mobility, which is not directly related to acquisition of general skills. We thus construct an index of general skills using just the other three measures (past number of industries, experience as top manager, and experience in a conglomerate). Using this alternative index, we obtain estimates of the pay-general attributes premium similar to those reported in Tables 5 and 6 in both statistical and economic terms.

The coverage of CEO profiles in BoardEx is better in the 2000s than in the 1990s, although the coverage is reasonably good since 1993. When we check whether an improvement in coverage over time could bias our estimates of the pay-general ability premium, we find this is not the case. Estimation of the regressions in Tables 5 and 6 separately for each decade indicate a similar CEO pay effect in both the 1993-1999 and 2000-2007 periods. We also check that the results are robust to the exclusion of financial firms from the sample.

We check the sensitivity of our estimates of the general ability premium to alternative proxies of firm size. Indeed, there is strong theoretical justification for a positive relation between CEO pay and firm size (Rosen, 1981; and Gabaix and Landier, 2008), which is backed up by strong empirical evidence (e.g., Baker, Jensen and Murphy 1988; and Murphy, 1999). In untabulated results, we find that the estimates of the general ability index are barely affected by
using alternative proxies of firm size such as market value or book value of assets. For example, we estimate annual pay premiums for generalist CEOs relative to specialist CEOs between $17 \%$ and $18 \%$, which are similar to the equivalent estimate of $18.6 \%$ in column (6) of Table 5.

We also perform robustness checks on the measure of Generalist Excess Pay. We calculate the measure of excess pay by performing the match between the multi-industry CEO and the portfolio of single-industry CEOs using two-digit SIC codes. Using this coarser industry classification has two main implications: First, we ensure that the industries are significantly different from each other, and, second, that we have more single-industry CEOs to use as a benchmark. In untabulated tests, we find the results to be robust to this alternative definition of the measure of excess pay.

## 4. Interpretation and other hypotheses

In this section, we discuss alternative hypotheses to an efficient functioning of the CEO market that could explain why generalist CEOs earn a pay premium. One prominent alternative explanation is that generalist CEOs could just be more high profile or "hyped up" (Malmendier and Tate, 2009). It could be also the case that generalist CEOs just feature more prominently in databases of executive search firms and have an easier time being recruited. Dasgupta and Ding (2010) emphasize the enhanced role of executive search firms in the last decades. Finally, it could be the case that generalist CEOs accumulate firm or industry experience because they are just "serial CEOs" who engage in job hopping (Giannetti, 2011).

In these cases, higher pay could just be a temporary phenomenon that would ultimately result in disappointing performance. Cazier and McInnis (2010) and Chang, Dasgupta, and Hilary (2010) find that boards tend to overpay for externally hired CEOs’ prior performance, as this pay
premium is negatively correlated with future performance at the hiring firm.
We investigate the relation between the CEO general ability index and firm performance to test for these alternative explanations. The alternative hypothesis predicts that firms hiring generalist CEOs would suffer poorer performance and lower shareholder returns. We estimate the relation between alternative measures of accounting and stock market performance (net profit margin, return on equity, Tobin's Q , and stock return) and the index of general managerial ability using firm fixed-effects and (annual) changes regressions. The changes regressions use the subsample of newly appointed CEOs and compare the average firm performance in the three years following an appointment with performance in the year before the appointment. The regressions include the same controls (coefficients not shown) as in Table 5.

Table 13 shows the results. We find a statistically insignificant relation between firm performance and the index of general managerial ability of the CEO. This result is not consistent with the alternative hypotheses but rather with an efficient working of the CEO labor market. ${ }^{18}$

We also look at whether generalist CEOs are exposed to greater risk of termination following poor firm performance. We estimate probit regressions where the dependent variable is a dummy that takes the value of one if there is a CEO turnover in a given firm-year. ${ }^{19}$ The explanatory variables of interest are interactions between past firm performance and the general ability index. Table 14 shows the results of the CEO turnover-performance sensitivity regressions. We measure performance using both accounting performance (ROA and industry-adjusted ROA) in columns (1) and (2) and stock market performance (stock return and abnormal stock return) in

[^14]columns (3) and (4). We find a positive relation between the generalist ability index and CEO turnover, but the relation does not seem to be triggered by poor firm performance. We find no difference in sensitivity of CEO turnover to prior firm performance for generalist and specialist CEOs. Indeed, the interaction term between the general ability index and firm performance is not statistically significant in any of the specifications. ${ }^{20}$

Overall, our results are consistent with an efficient market-based explanation of the wage premium earned by CEOs with general managerial skills. Our findings are consistent with models of efficient sorting of CEO talent (Gabaix and Landier, 2008) where the small dispersion of CEO talent at the top of the distribution results in small differences in firm value. ${ }^{21}$ These small differences in talent, however, translate into large CEO pay differences.

Murphy and Zabojnik $(2004,2007)$ develop a theory that predicts a generalist pay premium, but it does not necessarily imply that generalist CEOs perform better than specialists because CEOs can appropriate the surplus generated by their general skills. Additionally, it is not always the case that a generalist CEO is the best match for any type of firm. Specialist CEOs may be the best match for firms where firm-specific knowledge is an important dimension of the CEO skill set. The CEO turnover-performance sensitivity results are also consistent with the Murphy and Zabojnik (2007) findings that the increased relative importance of general managerial skills is not driven by more performance-related CEO terminations.

[^15]
## 5. Conclusion

This paper shows that CEOs with general managerial skills are paid at a premium over those with specific skills. We construct a new measure of the generality of human capital based on a CEO's résumé, including mobility across positions, firms, and industries, and experience as top executive and in a conglomerate. We find a positive relation between the index of general managerial ability and CEO pay using the sample of S\&P 1,500 firms in the 1993-2007 period. The results are robust to the inclusion of many firm and CEO characteristics as control variables, including firm and CEO fixed effects.

We estimate that generalist CEOs earn an average annual pay premium of $19 \%$ relative to specialist CEOs, which is nearly a million dollars in extra compensation per year. We show that compensation for general managerial skills increases the most when a firm is exposed to labor market conditions, namely, when it hires a generalist CEO from outside the firm to replace a specialist CEO. In addition, the generalist pay premium is higher when generalist CEOs are hired to perform complex tasks such as restructurings and acquisitions in order to adapt to an evolving business environment. Finally, we find no evidence consistent with alternative explanations of our findings such as compensation risk, risk aversion, sample selection bias, managerial entrenchment, and CEO talent and high profile.

Overall, we show that measurable CEO characteristics, in particular skills gathered through work experience, have significant explanatory power for CEO pay. We provide direct evidence of the growing importance of general managerial skills versus firm-specific skills in the market for CEOs. This trend is likely to expand opportunities for CEOs with more general managerial skills, and therefore lead to higher levels of CEO pay in equilibrium.

## References

Abowd, J., Kramarz, F., Margolis, D., 1999. High wage workers and high wage firms. Econometrica 67, 251-333.

Abadie, A., Imbens, G., 2011. Bias-corrected matching estimators for average treatment effects. Journal of Business and Economic Statistics 29, 1-11.

Ai, C., Norton, 2003. Interaction terms in logit and probit models. Economics Letters 80, 123129.

Baker, G., Jensen, M., Murphy, K. J., 1988. Compensation and incentives: Practice vs. theory. Journal of Finance 43, 593-616.

Bebchuk, L., Fried, J., Walker, D., 2002. Managerial power and rent extraction in the design of executive compensation. University of Chicago Law Review 69, 751-761.

Becker, G., 1962. Investment in human capital: A theoretical analysis. Journal of Political Economy 70, 9-49.

Berger, P., Ofek, E., 1995. Diversification’s effect on firm value. Journal of Financial Economics 37, 39-65.

Bertrand, M., Schoar, A., 2003. Managing with style: The effect of managers on firm policies. Quarterly Journal of Economics 68, 1169-1208.

Boone, A., Field, L., Karpoff, J., Raheja, C., 2007. The determinants of corporate board size and composition: An empirical analysis. Journal of Financial Economics 85, 66-101.

Cazier, R., McInnis, J., 2010. Do firms contract efficiently on past performance when hiring external CEO's? Unpublished working paper, Texas Christian University.

Chang, Y., Dasgupta, S., Hilary, G., 2010. CEO ability, pay, and firm performance. Management Science 56, 1633-1652.

Coles, J., Daniel, N., Naveen, L., 2008. Boards: Does one size fit all? Journal of Financial Economics 87, 329-356.

Coles, J., Li, Z., 2010. Managerial attributes, incentives, and performance. Unpublished working paper, Arizona State University.

Conyon, M., Core, J., Guay, W., 2011. Are US CEOs paid more than UK CEOs? Inferences from risk-adjusted pay. Review of Financial Studies 24, 402-438.

Cunat, V., Guadalupe, M., 2009a. Executive compensation and competition in the banking and financial sectors. Journal of Banking and Finance 33, 495-504.

Cunat, V., Guadalupe, M., 2009b. Globalization and the provision of incentives inside the firm: The effect of foreign competition. Journal of Labor Economics 27, 179-212.

Dasgupta, S., Ding, F., 2010. Search intermediaries, internal labor markets, and CEO pay. Unpublished working paper, Hong Kong University of Science and Technology.

Edmans, A., Gabaix, X., 2011. The effect of risk on the CEO market. Review of Financial Studies 24, 2822-2863.

Edmans, A., Gabaix, X., Landier, A., 2009. A multiplicative model of optimal CEO incentives in market equilibrium. Review of Financial Studies 22, 4881-4917.

Falato, A., Li, D., Milbourn, T., 2011. To each according to his ability? CEO pay and the market for CEOs. Unpublished working paper, Washington University in St Louis.

Fee, E., Hadlock, C., 2003. Raids, rewards, and reputations in the market for managerial talent. Review of Financial Studies 16-4, 1311-1353.

Fee, E., Hadlock, C., Pierce, J., 2010. Managers who lack style: Evidence from exogenous CEO changes. Unpublished working paper, Michigan State University.

Ferreira, D., Sah, R., 2012. Who gets to the top? Generalists versus specialists in organizations. RAND Journal of Economics, forthcoming.

Frydman, C., 2009. Rising through the ranks: The evolution of the market for corporate executives, 1936-2003. Unpublished working paper, MIT Sloan School.

Frydman, C., Jenter, D., 2010. CEO compensation. Annual Review of Financial Economics 2, 75-102.

Gabaix, X., Landier, A., 2008. Why has CEO pay increased so much? Quarterly Journal of Economics 123, 49-100.

Garicano, L., Rossi-Hansberg, E., 2006. Organization and inequality in a knowledge economy. Quarterly Journal of Economics 121, 1383-1435.

Garvey, G., Milbourn, T., 2003. Incentive compensation when executives can hedge the market: Evidence of relative performance evaluation in the cross section. Journal of Finance 58, 1557-1581.

Giannetti, M., 2011. Serial CEO incentives and the structure of managerial contracts. Journal of Financial Intermediation 20, 633-662.

Gompers, P., Ishii, J., Metrick, A., 2003. Corporate governance and equity prices. Quarterly Journal of Economics 118, 107-155.

Graham, J., Harvey, C., Puri, M., 2010. Managerial attitudes and corporate actions. Unpublished working paper, Duke University.

Graham, J., Li, S., Qiu, J., 2012. Managerial attributes and executive compensation. Review of Financial Studies 25, 144-186.

Hall, B., Murphy, K. J., 2002. Stock options for undiversified executives. Journal of Accounting and Economics 33, 3-42.

Hartzell, J., Starks, L., 2003. Institutional investors and executive compensation. Journal of Finance 58, 2351-2374.

Hubbard, R. G., Palia, D., 1995. Executive pay and performance: Evidence from the US banking industry. Journal of Financial Economics 39, 105-130.

Jenter, D., Lewellen, K., 2010. Performance-induced CEO turnover. Unpublished working paper, Stanford University.

Kaplan, S., Klebanov, M., Sorensen, M., 2012. Which CEO characteristics matter? Journal of Finance 67, 973-1007.

Lazear E., 2009. Firm-specific human capital: A skill-weights approach. Journal of Political Economy 117, 914-940.

Malmendier, U., Tate, G., 2009. Superstar CEOs. Quarterly Journal of Economics 124, 15931638.

Malmendier, U., Tate, G., Yan, J., 2011. Overconfidence and early-life experiences: The effect of managerial traits on corporate financial policies. Journal of Finance 66, 1687-1733.

Milbourn, T., 2003. CEO reputation and stock-based compensation. Journal of Financial Economics 68, 233-262.

Mitchell, M., Mulherin, J., 1996. The impact of industry shocks on takeover and restructuring activity. Journal of Financial Economics 41, 193-229.

Murphy, K. J., 1999. Executive compensation. In: Ashenfelter, O., Card, D. (Ed.), Handbook of Labor Economics. North Holland, Amsterdam, pp. 2485-2563.

Murphy, K. J., 2012. Executive compensation: Where we are, and how we got there. In: Constantinides, G., Harris, M., Stulz, R. (Ed.), Handbook of Economics and Finance. North Holland, Amsterdam, forthcoming.

Murphy, K. J., Zabojnik, J., 2004. CEO pay and appointments: A market-based explanation for recent trends. American Economic Review Papers and Proceedings 94, 192-196.

Murphy, K. J., Zabojnik, J., 2007. Managerial capital and the market for CEOs. Unpublished working paper, University of Southern California.

Oyer, P., 2008. The long-term labor market consequences of graduating from college in a bad economy. Journal of Finance 63, 2601-2628.

Piketty, T., Saez, E., 2003. Income inequality in the United States, 1913-1998. Quarterly Journal of Economics 118, 1-39.

Rosen, S., 1981. The economics of superstars. American Economic Review 71, 845-858.
Schoar, A., Zuo, L., 2011. Shaped by booms and busts: How the economy impacts CEO careers and management style. Unpublished working paper, MIT Sloan School.

Tate, G., Yang, L., 2011. The bright side of corporate diversification: Evidence from internal labor markets. Unpublished working paper, UCLA.

Tervio, M., 2008. The difference that CEOs make: An assignment model approach. American Economic Review 98, 642-668.

Xuan, Y., 2009. Empire-building or bridge-building? Evidence from new CEOs’ internal capital allocation decisions. Review of Financial Studies 22, 4919-4948.

Weisbach, M., 1988. Outside directors and CEO turnover. Journal of Financial Economics 20, 431-460.

## Table 1

General managerial ability index: principal component analysis
This table presents the results of applying principal components analysis to five proxies of general managerial ability based on a CEO past work experience (number of positions, number of firms, number of industries, CEO experience, and conglomerate experience). Factor loadings, scoring coefficients using the regression method, and eigenvalue and proportion of variation explained by the first factor are presented. The index is calculated by applying the scores to the standardized general ability components. The index is standardized to have zero mean and a standard deviation of one. Variable definitions are provided in Table A1 in the Appendix.

|  | Number of <br> Positions | Number of <br> Firms | Number of <br> Industries | CEO <br> Experience | Conglomerate <br> Experience |
| :--- | :---: | :---: | ---: | ---: | ---: |
| Loadings | 0.800 | 0.931 | 0.921 | 0.649 | 0.456 |
| Scores | 0.268 | 0.312 | 0.309 | 0.218 | 0.153 |
|  |  |  |  |  |  |
| Proportion Explained |  |  | 0.597 |  |  |
| Eigenvalue |  |  | 2.984 |  |  |

Table 2
CEO pay and general managerial ability by year and industry
This table presents the mean CEO general ability index and total pay per year and industry (Fama-French 12 industry groups) from 1993 to 2007. The index of general managerial ability is the first factor of applying principal components analysis to five proxies of general managerial ability based on a CEO past work experience (number of positions, number of firms, number of industries, CEO experience, and conglomerate experience). The index is standardized to have zero mean and a standard deviation of one. Generalist CEOs are those with general ability index above the yearly median and specialist CEOs are those with index below the median. The sample consists of Execucomp firms for which CEO profile data are available from BoardEx. All variables are winsorized at the 1th and 99th percentile values. Variable definitions are provided in Table A1 in the Appendix. *, **, *** indicates significance at the $10 \%, 5 \%$ and $1 \%$ levels.

| Panel A: By Year |  |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Year | General <br> Ability Index | Total Pay (\$000) | Generalist Total Pay (\$ 000) | Specialist <br> Total Pay <br> (\$ 000) | Generalist Pay Premium (\$ 000) | Generalist Excess Pay (\$ 000) | Observations |
| 1993 | -0.140 | 2,178 | 2,579 | 1,776 | 803 *** | 1,053 *** | 834 |
| 1994 | -0.177 | 2,310 | 2,834 | 1,800 | 1,034*** | 1,188 *** | 1,089 |
| 1995 | -0.115 | 2,459 | 2,963 | 1,987 | 976*** | 1,257 *** | 1,169 |
| 1996 | -0.076 | 3,165 | 3,859 | 2,473 | 1,386 *** | 1,923 *** | 1,261 |
| 1997 | -0.054 | 3,863 | 4,869 | 2,859 | 2,009 *** | 2,303 *** | 1,337 |
| 1998 | -0.039 | 4,099 | 5,036 | 3,171 | 1,865 *** | 2,558*** | 1,459 |
| 1999 | -0.023 | 4,919 | 6,222 | 3,634 | 2,588 *** | 3,194*** | 1,571 |
| 2000 | 0.014 | 5,522 | 7,240 | 3,823 | 3,417 *** | 3,914*** | 1,627 |
| 2001 | 0.034 | 5,551 | 7,171 | 3,938 | 3,232 *** | 3,656 *** | 1,565 |
| 2002 | 0.076 | 4,847 | 6,055 | 3,651 | 2,405 *** | 2,870 *** | 1,592 |
| 2003 | 0.064 | 4,552 | 5,775 | 3,334 | 2,441 *** | 2,621 *** | 1,666 |
| 2004 | 0.071 | 5,103 | 6,424 | 3,843 | 2,581 *** | 2,819 *** | 1,673 |
| 2005 | 0.066 | 5,301 | 6,497 | 4,105 | 2,392 *** | 2,979*** | 1,688 |
| 2006 | 0.065 | 5,443 | 6,886 | 4,064 | 2,823*** | 2,983*** | 1,710 |
| 2007 | 0.036 | 5,494 | 6,844 | 4,144 | 2,700 *** | 2,731 *** | 1,668 |
| Panel B: By Industry |  |  |  |  |  |  |  |
| Industry | General <br> Ability Index | $\begin{gathered} \text { Total Pay } \\ (\$ 000) \\ \hline \end{gathered}$ | Generalist Total Pay (\$ 000) | Specialist <br> Total Pay (\$000) | $\qquad$ | Generalist Excess Pay (\$ 000) | Observations |
| Consumer Nondurables | -0.047 | 4,431 | 5,913 | 3,171 | 2,743 *** | 2,347 *** | 1,504 |
| Consumer Durables | -0.017 | 3,716 | 4,115 | 3,323 | 792 ** | 1,419 *** | 668 |
| Manufacturing | 0.106 | 3,479 | 4,246 | 2,582 | 1,665*** | 1,673 *** | 2,893 |
| Oil, Gas, and Coal | -0.036 | 5,185 | 6,692 | 3,799 | 2,893 *** | 3,255 *** | 910 |
| Chemicals | 0.223 | 4,227 | 4,826 | 3,256 | 1,570 *** | 2,102 *** | 752 |
| Business Equipment | 0.047 | 4,769 | 5,731 | 3,756 | 1,975 *** | 2,814*** | 3,681 |
| Telephone and Television | 0.472 | 8,963 | 11,665 | 4,409 | 7,256 *** | 7,692 *** | 494 |
| Utilities | 0.362 | 2,789 | 3,452 | 1,538 | 1,914*** | 1,350 *** | 1,233 |
| Wholesale and Retail | -0.167 | 3,804 | 5,115 | 2,834 | 2,281 *** | 2,274*** | 2,581 |
| Healthcare and Drugs | 0.003 | 4,677 | 5,796 | 3,408 | 2,388 *** | 2,726 *** | 1,657 |
| Finance | -0.228 | 5,918 | 8,322 | 4,299 | 4,023*** | 3,994*** | 3,064 |
| Other | -0.036 | 4,357 | 5,364 | 3,448 | 1,916 *** | 2,531 *** | 2,472 |
| Total | 0.000 | 4,519 | 5,679 | 3,377 | 2,302 | 2,663 | 21,909 |

Table 3
Summary statistics
This table presents the mean, median, standard deviation, minimum, maximum and number of observations for each variable. The sample consists of Execucomp firms for which CEO profile data are available from BoardEx in the 1993-2007 period. All variables are winsorized at the 1th and 99th percentile values. Variable definitions are provided in Table A1 in the Appendix.

| Variable | Mean | Median | Standard <br> Deviation | Minimum | Maximum | Observations |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Panel A: CEO Pay |  |  |  |  |  |  |
| Total Pay (\$ 000) | 4,519 | 2,384 | 5,997 | 198 | 36,332 | 21,909 |
| Cash Pay (\$000) | 1,301 | 939 | 1,214 | 35 | 7,625 | 21,909 |
| Equity Pay (\$000) | 2,525 | 852 | 4,672 | 0 | 29,704 | 18,813 |
| Generalist Excess Pay (\$000) | 2,099 | 204 | 5,689 | -4,041 | 32,598 | 21,895 |
| Panel B: CEO Characteristics |  |  |  |  |  |  |
| General Ability Index | 0.000 | -0.182 | 1.000 | -1.504 | 7.230 | 21,909 |
| Number of Positions | 5.750 | 5.000 | 3.231 | 0.000 | 31.000 | 21,909 |
| Number of Firms | 1.775 | 1.000 | 1.902 | 0.000 | 18.000 | 21,909 |
| Number of Industries | 1.517 | 1.000 | 1.583 | 0.000 | 14.000 | 21,909 |
| CEO Experience Dummy | 0.354 | 0.000 | 0.478 | 0.000 | 1.000 | 21,909 |
| Conglomerate Experience Dummy | 0.739 | 1.000 | 0.439 | 0.000 | 1.000 | 21,909 |
| CEO Age | 55.548 | 56.000 | 7.400 | 29.000 | 92.000 | 20,841 |
| CEO Tenure | 7.969 | 6.000 | 7.089 | 1.000 | 57.000 | 20,371 |
| External Hire Dummy | 0.401 | 0.000 | 0.490 | 0.000 | 1.000 | 21,909 |
| MBA Dummy | 0.302 | 0.000 | 0.459 | 0.000 | 1.000 | 21,909 |
| CEO-Chair Dummy | 0.622 | 1.000 | 0.485 | 0.000 | 1.000 | 21,909 |
| First Year as CEO Dummy | 0.073 | 0.000 | 0.260 | 0.000 | 1.000 | 21,909 |
| Ivy League Dummy | 0.208 | 0.000 | 0.406 | 0.000 | 1.000 | 21,909 |
| Recession Graduate Dummy | 0.296 | 0.000 | 0.457 | 0.000 | 1.000 | 21,909 |
| Fast Track Career | 48.323 | 49.000 | 8.315 | 23.000 | 90.000 | 20,043 |
| Panel C: Firm Characteristics |  |  |  |  |  |  |
| Sales (\$ milions) | 4,415 | 1,294 | 8,772 | 27 | 56,877 | 21,875 |
| Tobin's Q | 1.996 | 1.515 | 1.386 | 0.801 | 8.894 | 21,826 |
| ROA | 0.089 | 0.087 | 0.094 | -0.298 | 0.361 | 21,408 |
| Volatility | 0.377 | 0.317 | 0.223 | 0.101 | 1.294 | 21,677 |
| Stock Return | 0.152 | 0.097 | 0.472 | -0.775 | 2.208 | 19,414 |
| Firm Age | 23.043 | 18.000 | 19.029 | 0.000 | 82.000 | 21,728 |
| Diversification Dummy | 0.571 | 1.000 | 0.495 | 0.000 | 1.000 | 19,221 |
| Leverage | 0.230 | 0.217 | 0.182 | 0.000 | 0.828 | 21,793 |
| Cash | 0.132 | 0.059 | 0.167 | 0.001 | 0.751 | 21,871 |
| R\&D | 0.027 | 0.000 | 0.052 | 0.000 | 0.271 | 21,878 |
| CAPEX | 0.056 | 0.043 | 0.053 | 0.000 | 0.286 | 20,797 |
| ROE | 0.103 | 0.124 | 0.317 | -1.537 | 1.577 | 21,869 |
| Net Profit Margin | 0.041 | 0.058 | 0.198 | -1.320 | 0.410 | 21,864 |
| Board Independence | 0.668 | 0.700 | 0.172 | 0.000 | 1.000 | 15,147 |
| Institutional Ownership Herfindahl | 0.060 | 0.047 | 0.063 | 0.000 | 1.000 | 21,541 |
| GIM Governance Index | 9.298 | 9.000 | 2.650 | 1.000 | 18.000 | 17,275 |
| Industry Sales Herfindahl | 0.073 | 0.050 | 0.074 | 0.008 | 0.939 | 21,541 |

## Table 4

General managerial ability and CEO and firm characteristics
This table presents the mean of CEO and firm characteristics for the samples of generalist CEOs (those with general ability index above the yearly median) and specialist CEOs (those with general ability index above the yearly median), the associated difference, and the correlation coefficient of the general ability index with CEO and firm characteristics. The sample consists of Execucomp firms for which CEO profile data are available from BoardEx in the 1993-2007 period. Variable definitions are provided in Table A1 in the Appendix. ${ }^{*}$, ${ }^{* *}$, ${ }^{* * *}$ indicates significance at the $10 \%, 5 \%$ and $1 \%$ levels.

| Variable | Generalists | Specialists | Difference | Correlation |
| :--- | ---: | ---: | ---: | ---: |
| CEO Age | 56.409 | 54.716 | $1.693^{* * *}$ | $0.151^{* * *}$ |
| CEO Tenure | 7.200 | 8.749 | $-1.549^{* * *}$ | $-0.122^{* * *}$ |
| External Hire Dummy | 0.458 | 0.345 | $0.114^{* * *}$ | $0.130^{* * *}$ |
| MBA Dummy | 0.368 | 0.238 | $0.131^{* * *}$ | $0.166^{* * *}$ |
| CEO-Chair Dummy | 0.692 | 0.553 | $0.139^{* * *}$ | $0.181^{* * *}$ |
| Sales | 7.619 | 6.860 | $0.759^{* * *}$ | $0.253^{* * *}$ |
| Tobin's Q | 1.949 | 2.043 | $-0.093^{* * *}$ | $-0.041^{* * *}$ |
| ROA | 0.128 | 0.133 | $-0.005^{* * *}$ | $-0.076^{* * *}$ |
| Volatility | 0.367 | 0.386 | $-0.019^{* * *}$ | $-0.049^{* * *}$ |
| Stock Return | 0.146 | 0.157 | $-0.012^{*}$ | $-0.013^{* *}$ |
| Firm Age | 25.730 | 20.408 | $5.321^{* * *}$ | $0.150^{* * *}$ |
| Diversification Dummy | 0.635 | 0.505 | $0.130^{* * *}$ | $0.175^{* * *}$ |
| Leverage | 0.245 | 0.215 | $0.031^{* * *}$ | $0.107^{* * *}$ |
| Cash | 0.127 | 0.138 | $-0.011^{* * *}$ | $-0.041^{* * *}$ |
| R\&D | 0.029 | 0.025 | $0.004^{* * *}$ | $0.024^{* * *}$ |
| CAPEX | 0.053 | 0.060 | $-0.008^{* * *}$ | $-0.098^{* * *}$ |

Table 5
CEO total pay and general managerial ability
This table presents estimates of OLS and firm and CEO fixed effects panel regressions of the logarithm of CEO total pay on the general ability index and other CEO- and firm-level control variables. The general ability index dummy takes the value of one if the general ability index is above the yearly median. The regressions also include year and industry (two-digit SIC) fixed effects. The sample consists of Execucomp firms for which CEO profile data are available from BoardEx in the 1993-2007 period. Variable definitions are provided in Table A1 in the Appendix. Robust $t$-statistics adjusted for firm-level clustering are reported in brackets. ${ }^{*}$, ${ }^{* *}$, ${ }^{* * *}$ indicates significance at the $10 \%, 5 \%$ and $1 \%$ levels.

|  | (1) | (2) | (3) | (4) | (5) | (6) | (7) | (8) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | OLS | OLS | OLS | Firm Fixed Effects | CEO Fixed Effects | OLS | Firm Fixed Effects | CEO Fixed Effects |
| General Ability Index |  |  | $\begin{gathered} \hline 0.117 * * * \\ {[7.881]} \end{gathered}$ | $\begin{array}{r} \hline 0.073^{* * *} \\ {[5.595]} \end{array}$ | $\begin{gathered} \hline 0.094^{* *} \\ {[2.411]} \end{gathered}$ |  |  |  |
| General Ability Index Dummy |  |  |  |  |  | $\begin{array}{r} 0.186 * * * \\ {[7.147]} \end{array}$ | $\begin{gathered} 0.136 * * * \\ {[6.509]} \end{gathered}$ | $\begin{gathered} 0.110^{* * *} \\ {[3.317]} \end{gathered}$ |
| CEO Age |  | $\begin{gathered} -0.005^{* *} \\ {[-2.023]} \end{gathered}$ | $\begin{array}{r} -0.007 * * * \\ {[-3.311]} \end{array}$ | $\begin{array}{r} -0.006 * * * \\ {[-3.304]} \end{array}$ | $\begin{array}{r} 0.000 \\ {[0.028]} \end{array}$ | $\begin{array}{r} -0.007 * * * \\ {[-2.923]} \end{array}$ | $\begin{array}{r} -0.006 * * * \\ {[-2.990]} \end{array}$ | $\begin{array}{r} 0.001 \\ {[0.101]} \end{array}$ |
| CEO Tenure |  | $\begin{array}{r} -0.009 * * * \\ {[-3.362]} \end{array}$ | $\begin{gathered} -0.006 * * \\ {[-2.103]} \end{gathered}$ | $\begin{array}{r} 0.001 \\ {[0.684]} \end{array}$ | $\begin{gathered} 0.023^{*} \\ {[1.714]} \end{gathered}$ | $\begin{gathered} -0.007 * * \\ {[-2.467]} \end{gathered}$ | $\begin{array}{r} 0.001 \\ {[0.320]} \end{array}$ | $\begin{array}{r} 0.014 \\ {[1.141]} \end{array}$ |
| External Hire Dummy |  | $\begin{array}{r} 0.165^{* * *} \\ {[5.963]} \end{array}$ | $\begin{gathered} 0.124^{* * *} \\ {[4.421]} \end{gathered}$ | $\begin{array}{r} 0.141^{* * *} \\ {[5.915]} \end{array}$ | $\begin{array}{r} -0.126 \\ {[-1.058]} \end{array}$ | $\begin{gathered} 0.134^{* * *} \\ {[4.809]} \end{gathered}$ | $\begin{gathered} 0.151 * * * \\ {[6.466]} \end{gathered}$ | $\begin{array}{r} -0.117 \\ {[-0.993]} \end{array}$ |
| MBA Dummy |  | $\begin{gathered} 0.053^{* *} \\ {[1.969]} \end{gathered}$ | $\begin{array}{r} 0.025 \\ {[0.947]} \end{array}$ | $\begin{gathered} 0.050 * * \\ {[2.171]} \end{gathered}$ |  | $\begin{array}{r} 0.031 \\ {[1.166]} \end{array}$ | $\begin{gathered} 0.054 * * \\ {[2.355]} \end{gathered}$ |  |
| CEO-Chair Dummy |  | $\begin{array}{r} 0.200 * * * \\ {[7.093]} \end{array}$ | $\begin{array}{r} 0.169 * * * \\ {[6.038]} \end{array}$ | $\begin{array}{r} 0.059 * * * \\ {[2.850]} \end{array}$ | $\begin{gathered} 0.063 * * \\ {[2.367]} \end{gathered}$ | $\begin{array}{r} 0.177 * * * \\ {[6.273]} \end{array}$ | $\begin{gathered} 0.063 * * * \\ {[3.033]} \end{gathered}$ | $\begin{gathered} 0.065 * * \\ {[2.458]} \end{gathered}$ |
| First Year as CEO Dummy |  | $\begin{array}{r} 0.085^{* * *} \\ {[2.637]} \end{array}$ | $\begin{array}{r} 0.096 * * * \\ {[3.012]} \end{array}$ | $\begin{array}{r} 0.125^{* * *} \\ {[4.492]} \end{array}$ | $\begin{array}{r} 0.188 * * * \\ {[6.362]} \end{array}$ | $\begin{gathered} 0.090^{* * *} \\ {[2.809]} \end{gathered}$ | $\begin{array}{r} 0.123 * * * \\ {[4.431]} \end{array}$ | $\begin{array}{r} 0.185 * * * \\ {[6.310]} \end{array}$ |
| Sales (log) | $\begin{gathered} 0.467 * * * \\ {[35.064]} \end{gathered}$ | $\begin{gathered} 0.455 * * * \\ {[33.704]} \end{gathered}$ | $\begin{gathered} 0.434^{* * *} \\ {[31.752]} \end{gathered}$ | $\begin{gathered} 0.305^{* * *} \\ {[14.462]} \end{gathered}$ | $\begin{gathered} 0.272 * * * \\ {[10.830]} \end{gathered}$ | $\begin{gathered} 0.441^{* * *} \\ {[32.601]} \end{gathered}$ | $\begin{gathered} 0.305 * * * \\ {[14.475]} \end{gathered}$ | $\begin{gathered} 0.274 * * * \\ {[10.848]} \end{gathered}$ |
| Tobin's Q | $\begin{gathered} 0.136 * * * \\ {[7.905]} \end{gathered}$ | $\begin{array}{r} 0.135^{* * *} \\ {[8.059]} \end{array}$ | $\begin{gathered} 0.128 * * * \\ {[7.693]} \end{gathered}$ | $\begin{array}{r} 0.081^{* * *} \\ {[6.378]} \end{array}$ | $\begin{array}{r} 0.082^{* * *} \\ {[5.369]} \end{array}$ | $\begin{array}{r} 0.131 * * * \\ {[7.816]} \end{array}$ | $\begin{gathered} 0.081^{* * *} \\ {[6.344]} \end{gathered}$ | $\begin{gathered} 0.081^{* * *} \\ {[5.372]} \end{gathered}$ |
| ROA | $\begin{array}{r} -0.941^{* * *} \\ {[-5.213]} \end{array}$ | $\begin{array}{r} -0.897 * * * \\ {[-4.947]} \end{array}$ | $\begin{array}{r} -0.826^{* * *} \\ {[-4.585]} \end{array}$ | $\begin{array}{r} 0.180 \\ {[1.072]} \end{array}$ | $\begin{array}{r} 0.278 \\ {[1.529]} \end{array}$ | $\begin{array}{r} -0.845^{* * *} \\ {[-4.665]} \end{array}$ | $\begin{array}{r} 0.170 \\ {[1.015]} \end{array}$ | $\begin{array}{r} 0.279 \\ {[1.534]} \end{array}$ |
| ROA (t-1) | $\begin{array}{r} -0.083 \\ {[-0.498]} \end{array}$ | $\begin{array}{r} -0.037 \\ {[-0.216]} \end{array}$ | $\begin{array}{r} 0.031 \\ {[0.180]} \end{array}$ | $\begin{array}{r} 0.560^{* * *} \\ {[3.750]} \end{array}$ | $\begin{array}{r} 0.564 * * * \\ {[3.554]} \end{array}$ | $\begin{array}{r} 0.010 \\ {[0.059]} \end{array}$ | $\begin{gathered} 0.568^{* * *} \\ {[3.815]} \end{gathered}$ | $\begin{array}{r} 0.573 * * * \\ {[3.615]} \end{array}$ |
| Volatility | $\begin{array}{r} 0.222 * * * \\ {[3.380]} \end{array}$ | $\begin{array}{r} 0.588^{* * *} \\ {[2.656]} \end{array}$ | $\begin{gathered} 0.151^{* *} \\ {[2.378]} \end{gathered}$ | $\begin{array}{r} 0.033 \\ {[0.666]} \end{array}$ | $\begin{gathered} 0.118 * * \\ {[2.259]} \end{gathered}$ | $\begin{gathered} 0.567^{* * *} \\ {[2.580]} \end{gathered}$ | $\begin{array}{r} 0.116 \\ {[0.681]} \end{array}$ | $\begin{gathered} 0.409 * * \\ {[2.258]} \end{gathered}$ |
| Stock Return | $\begin{gathered} 0.118 * * * \\ {[5.118]} \end{gathered}$ | $\begin{array}{r} 0.121^{* * *} \\ {[5.328]} \end{array}$ | $\begin{array}{r} 0.128^{* * *} \\ {[5.700]} \end{array}$ | $\begin{array}{r} 0.107 * * * \\ {[5.653]} \end{array}$ | $\begin{gathered} 0.099 * * * \\ {[4.923]} \end{gathered}$ | $\begin{gathered} 0.126 * * * \\ {[5.588]} \end{gathered}$ | $\begin{gathered} 0.108 * * * \\ {[5.679]} \end{gathered}$ | $\begin{gathered} 0.099 * * * \\ {[4.917]} \end{gathered}$ |
| Stock Return (t-1) | $\begin{gathered} 0.198^{* * *} \\ {[11.051]} \end{gathered}$ | $\begin{gathered} 0.198 * * * \\ {[11.268]} \end{gathered}$ | $\begin{gathered} 0.202 * * * \\ {[11.602]} \end{gathered}$ | $\begin{array}{r} 0.156 * * * \\ {[9.900]} \end{array}$ | $\begin{array}{r} 0.158^{* * *} \\ {[9.792]} \end{array}$ | $\begin{gathered} 0.200^{* * *} \\ {[11.415]} \end{gathered}$ | $\begin{gathered} 0.155 * * * \\ {[9.850]} \end{gathered}$ | $\begin{array}{r} 0.158 * * * \\ {[9.774]} \end{array}$ |
| Firm Age | $\begin{array}{r} -0.001 \\ {[-0.609]} \end{array}$ | $\begin{array}{r} -0.001 \\ {[-0.796]} \end{array}$ | $\begin{array}{r} -0.000 \\ {[-0.612]} \end{array}$ | $\begin{array}{r} -0.003 \\ {[-1.393]} \end{array}$ | $\begin{array}{r} 0.002 \\ {[0.973]} \end{array}$ | $\begin{array}{r} -0.000 \\ {[-0.623]} \end{array}$ | $\begin{array}{r} -0.003 \\ {[-1.546]} \end{array}$ | $\begin{array}{r} 0.001 \\ {[0.861]} \end{array}$ |
| Diversification Dummy | $\begin{gathered} -0.052 * \\ {[-1.824]} \end{gathered}$ | $\begin{gathered} -0.052 * \\ {[-1.871]} \end{gathered}$ | $\begin{gathered} -0.068 * * \\ {[-2.483]} \end{gathered}$ | $\begin{array}{r} -0.036 \\ {[-1.509]} \end{array}$ | $\begin{gathered} -0.049 * \\ {[-1.733]} \end{gathered}$ | $\begin{gathered} -0.059 * * \\ {[-2.172]} \end{gathered}$ | $\begin{array}{r} -0.033 \\ {[-1.383]} \end{array}$ | $\begin{gathered} -0.049 * \\ {[-1.722]} \end{gathered}$ |
| Observations | 12,775 | 12,775 | 12,775 | 12,775 | 12,775 | 12,775 | 12,775 | 12,775 |
| R-squared | 0.477 | 0.493 | 0.503 | 0.748 | 0.799 | 0.499 | 0.748 | 0.799 |

## Table 6

CEO pay mix and general managerial ability
Columns (1)-(9) present estimates of OLS and firm and CEO fixed effects panel regressions of the logarithm of CEO cash, equity, and total pay on the general ability index and other CEO- and firm-level control variables. Column (10) presents estimates of a Tobit model of the ratio of CEO equity pay to total pay. The regressions include the same CEO- and firm-level control variables as in Table 5 (coefficients not shown). The regressions also include year and industry (twodigit SIC) fixed effects. The sample consists of Execucomp firms for which CEO profile data are available from BoardEx in the 1993-2007 period. Variable definitions are provided in Table A1 in the Appendix. Robust t-statistics adjusted for firm-level clustering are reported in brackets. *, **, *** indicates significance at the $10 \%, 5 \%$ and $1 \%$ levels.

|  | (1) | (2) | (3) | (4) | (5) | (6) | (7) | (8) | (9) | (10) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Cash Pay |  |  | Equity Pay |  |  | Total Pay |  |  | $\overline{\text { Equity/Total Pay }}$ |
|  | OLS | Firm Fixed Effects | CEO Fixed Effects | OLS | Firm Fixed Effects | CEO Fixed Effects | OLS | Firm Fixed Effects | CEO Fixed Effects | Tobit |
| General Ability Index | 0.035*** | 0.028*** | 0.053** | 0.161*** | 0.091*** | 0.090 | 0.070*** | 0.059*** | 0.066** | 0.032*** |
|  | [3.547] | [3.448] | [2.269] | [7.840] | [3.766] | [1.472] | [5.711] | [5.252] | [2.226] | [4.859] |
| CEO Age | 0.002 | $-0.003 * * *$ | -0.000 | $-0.018^{* * *}$ | -0.010*** | 0.004 | 0.001 | -0.002 | 0.000 | -0.005*** |
|  | [1.209] | [-2.608] | [-0.059] | [-5.567] | [-2.610] | [0.242] | [0.729] | [-1.352] | [0.056] | [-5.442] |
| CEO Tenure | -0.002 | 0.005*** | 0.036*** | 0.003 | 0.002 | 0.031 | -0.001 | 0.008*** | 0.042*** | $-0.004^{* *}$ |
|  | [-0.734] | [3.701] | [3.910] | [0.740] | [0.418] | [1.366] | [-0.235] | [4.690] | [4.250] | [-3.599] |
| External Hire Dummy | 0.080*** | 0.059*** | 0.062 | 0.258*** | 0.301*** | -0.167 | 0.105*** | 0.111*** | -0.020 | -0.002 |
|  | [3.908] | [3.784] | [0.657] | [6.262] | [6.877] | [-0.848] | [4.422] | [5.132] | [-0.197] | [-0.135] |
| MBA Dummy | -0.017 | -0.004 |  | 0.006 | 0.039 |  | -0.011 | 0.009 |  | 0.020* |
|  | [-0.954] | [-0.275] |  | [0.141] | [0.914] |  | [-0.497] | [0.438] |  | [1.694] |
| CEO-Chair Dummy | 0.100*** | 0.027** | 0.040** | 0.175*** | 0.066* | 0.039 | 0.132*** | 0.038** | 0.027 | 0.023* |
|  | [5.155] | [2.007] | [2.488] | [4.158] | [1.765] | [0.879] | [5.615] | [2.148] | [1.269] | [1.727] |
| First Year as CEO Dummy | -0.136*** | $-0.127^{* * *}$ | -0.080*** | 0.270*** | 0.266*** | 0.318*** | -0.066*** | -0.028 | 0.026 | 0.095*** |
|  |  |  |  |  |  |  | [-2.584] |  | [1.161] |  |
| Equity/Total Pay |  |  |  |  |  |  | 1.919*** | 1.812*** | 1.805*** |  |
|  |  |  |  |  |  |  | [44.479] | [67.437] | [63.379] |  |
| Observations | 12,741 | 12,741 | 12,741 | 8,906 | 8,906 | 8,906 | 10,986 | 10,986 | 10,986 | 6,675 |
| R-squared | 0.538 | 0.784 | 0.835 | 0.468 | 0.747 | 0.803 | 0.712 | 0.873 | 0.903 |  |

## Table 7

CEO total pay and general managerial ability: index components
This table presents estimates of OLS and firm fixed effects panel regressions of the logarithm of CEO total pay on individual proxies of general managerial ability: past number of positions, number of firms, number of industries, CEO experience, and conglomerate experience. The regressions include the same CEOand firm-level control variables as in Table 5 (coefficients not shown). The regressions also include year and industry (two-digit SIC) fixed effects. The sample consists of Execucomp firms for which CEO profile data are available from BoardEx in the 1993-2007 period. Variable definitions are provided in Table A1 in the Appendix. Robust $t$-statistics adjusted for firm-level clustering are reported in brackets. *, **, ${ }^{* * *}$ indicates significance at the $10 \%, 5 \%$ and $1 \%$ levels.

|  | (1) | (2) | (3) | (4) | (5) | (6) | (7) | (8) | (9) | (10) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Number of Positions |  | Number of Firms |  | Number of Industries |  | CEO Experience |  | Conglomerate Experience |  |
|  | OLS | Firm Fixed Effects | OLS | $\begin{gathered} \hline \text { Firm Fixed } \\ \text { Effects } \\ \hline \end{gathered}$ | OLS | Firm Fixed Effects | OLS | Firm Fixed Effects | OLS | Firm Fixed Effects |
| General Ability Measure | 0.022*** | 0.015*** | 0.060*** | 0.032*** | 0.065*** | 0.037*** | 0.152*** | 0.102*** | 0.123*** | 0.079** |
|  | [5.111] | [3.764] | [7.858] | [5.205] | [6.930] | [5.014] | [5.211] | [3.817] | [3.556] | [2.305] |
| Observations | 12,775 | 12,775 | 12,775 | 12,775 | 12,775 | 12,775 | 12,775 | 12,775 | 12,775 | 12,775 |
| R-squared | 0.496 | 0.747 | 0.502 | 0.748 | 0.500 | 0.748 | 0.497 | 0.747 | 0.495 | 0.747 |

Table 8

## CEO pay and general managerial ability: new CEOs and switch of CEO type

Panel A presents estimates of OLS panel regressions of the logarithm of CEO total, cash and equity pay on the general ability index using a sample of newly appointed CEOs. Panel B presents estimates of OLS panel regressions of the logarithm of CEO total, cash and equity pay on dummies for the switch of CEO type. A CEO is classified as a generalist if he has general ability index above 75th percentile in each year and as a specialist in the other cases. The switch of CEO type dummy variables are: (1) if there is a CEO turnover but no switch of CEO type (no switch of CEO type); (2) if a specialist CEO is replaced by a generalist CEO hired from outside the firm (switch to generalist - external hire); (3) if a generalist CEO is replaced by a specialist CEO hired from outside the firm (switch to specialist - external hire); (4) if a specialist CEO is replaced by a generalist CEO internally appointed (switch to generalist - internal hire); and (5) if a generalist CEO is replaced by a specialist CEO internally appointed (switch to specialist - internal hire). The regressions include the same CEO- and firm-level control variables as in Table 5 (coefficients not shown). The regressions also include year and industry (two-digit SIC) fixed effects. The sample consists of Execucomp firms for which CEO profile data are available from BoardEx in the 1993-2007 period. Variable definitions are provided in Table A1 in the Appendix. Robust t-statistics adjusted for firm-level clustering are reported in brackets. ${ }^{*},{ }^{* *},{ }^{* * *}$ indicates significance at the $10 \%, 5 \%$ and $1 \%$ levels.

| Panel A: New CEO Appointments |  |  |  |
| :---: | :---: | :---: | :---: |
|  | (1) | (2) | (3) |
|  | Total Pay | Cash Pay | Equity Pay |
| General Ability Index | 0.115*** | 0.031 | 0.173*** |
|  | [3.348] | [1.445] | [3.119] |
| Observations | 785 | 782 | 539 |
| R-squared | 0.569 | 0.616 | 0.560 |
| Panel B: Switch of CEO Type |  |  |  |
|  | (1) | (2) | (3) |
|  | Total Pay | Cash Pay | Equity Pay |
| No Switch of CEO Type | 0.061 | -0.010 | 0.086 |
|  | [1.161] | [-0.288] | [1.003] |
| Switch to Generalist - External Hire | 0.266*** | -0.076 | 0.432*** |
|  | [3.170] | [-1.478] | [3.288] |
| Switch to Specialist - External Hire | -0.042 | -0.086 | -0.010 |
|  | [-0.333] | [-0.993] | [-0.046] |
| Switch to Generalist - Internal Hire | 0.100 | -0.066 | 0.205* |
|  | [1.151] | [-1.172] | [1.766] |
| Switch to Specialist - Internal Hire | -0.141** | -0.104** | -0.143 |
|  | [-1.976] | [-2.130] | [-1.140] |
| F-test: |  |  |  |
| Switch to Generalist vs. Specialist - External Hire | 4.48** | 0.01 | 3.39* |
| Industry dummies | Yes | Yes | Yes |
| Observations | 12,775 | 12,741 | 8,906 |
| R-squared | 0.493 | 0.535 | 0.469 |

## Table 9

## CEO pay, general managerial ability and talent

Panel A presents estimates of OLS and firm fixed effects panel regressions of the logarithm of CEO total, cash, and equity pay on the general ability index. The Ivy League Dummy takes the value of one if the CEO attended an Ivy league school at any academic level. The Recession Graduate Dummy takes the value of one if the CEO graduated in a NBER recession year based on his first academic degree. Fast Track Career is the age at which a CEO became CEO for the first time. Panel B presents estimates of OLS regressions of the logarithm of total, cash, and equity pay in the 1993-1999 period on the general ability index in 2007. The regressions include the same CEO- and firm-level control variables as in Table 5 (coefficients not shown). The regressions also include year and industry (two-digit SIC) fixed effects. The sample consists of Execucomp firms for which CEO profile data are available from BoardEx in the 1993-2007 period. Variable definitions are provided in Table A1 in the Appendix. Robust t-statistics adjusted for firm-level clustering are reported in brackets. *, **, *** indicates significance at the $10 \%, 5 \%$ and $1 \%$ levels.

|  | Panel A: | Controlling for | O Talent |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | (1) | (2) | (3) | (4) | (5) | (6) |
|  | Total | Pay | Cash |  | Equity |  |
|  | OLS | Firm Fixed Effects | OLS | Firm Fixed Effects | OLS | irm Fixed Effects |
| General Ability Index | 0.118*** | 0.072*** | 0.037*** | 0.030*** | 0.148*** | 0.079*** |
|  | [7.743] | [5.439] | [3.672] | [3.514] | [7.010] | [3.294] |
| Ivy League Dummy | 0.034 | 0.005 | 0.011 | 0.011 | 0.090* | 0.114* |
|  | [0.885] | [0.191] | [0.446] | [0.621] | [1.891] | [1.730] |
| Recession Graduate Dummy | 0.061** | 0.055** | 0.027 | 0.018 | 0.047 | 0.066 |
|  | [2.241] | [2.350] | [1.441] | [1.201] | [1.196] | [1.621] |
| Fast Track Career | 0.003 | 0.000 | 0.003 | 0.001 | -0.008* | -0.006* |
|  | [1.140] | [0.083] | [1.426] | [1.086] | [-1.798] | [-1.764] |
| Observations | 12,769 | 12,769 | 12,735 | 12,735 | 8,903 | 8,903 |
| R-squared | 0.503 | 0.748 | 0.539 | 0.784 | 0.470 | 0.748 |
|  | Pay in 1993 | 3-1999 and G | alist Ability | Index in 2007 |  |  |
|  | (1) |  | (2) |  | (3) |  |
|  | Total |  | Cash |  | Equity |  |
| General Ability Index | 0.08 |  | 0.0 |  | 0.08 |  |
|  | [1.7 |  | [1.5 |  | [1.35 |  |
| Observations | 71 |  | 71 |  | 57 |  |
| R-squared | 0.6 |  | 0.6 |  | 0.6 |  |

## Table 10

## Effect of firm size, diversification and corporate governance

This table presents estimates of OLS and firm fixed effects panel regressions of the logarithm of CEO total pay on the general ability index. In Panel A the small and large firm groups consist of those firms whose Sales are below and above the yearly median, and the stand-alone and diversified firm groups consists of those firms with number of business segments equal to and above one. In Panel B the low and high Board Independence and Institutional Ownership Herfindahl groups consist of those firms that are below and above the yearly median. In Panel C the low and high GIM Governance Index and Industry Sales Herfindahl groups consist of those firms that are below and above the yearly median. The regressions include the same CEO- and firm-level control variables as in Table 5 (coefficients not shown). The regressions also include year and industry (two-digit SIC) fixed effects. The sample consists of Execucomp firms for which CEO profile data are available from BoardEx in the 1993-2007 period. Variable definitions are provided in Table A1 in the Appendix. Robust t-statistics adjusted for firm-level clustering are reported in brackets. ${ }^{*}$, **, *** indicates significance at the $10 \%, 5 \%$ and $1 \%$ levels.


## Table 11

Effect of firm performance and industry shocks: new CEOs only
This table presents estimates of OLS panel regressions of the logarithm of CEO total pay on a dummy variable that takes the value of one if the general ability index is above the yearly median. The Yes Distress firm group includes firms with return on assets below the industry median (two-digit SIC) for two consecutive years and the No Distress firm group includes all other cases. The High M\&A Activity group includes firms with acquisitions in the top quartile of the distribution and the Low M\&A Activity group includes all other cases. The High Industry Shocks group includes firms operating in industries in the top quartile of the distribution of the difference between industry sales growth and the average sales growth across all industries and the Low Industry Shocks group includes all other cases. The regressions include the same CEO- and firm-level control variables as in Table 5 (coefficients not shown). The regressions also include year and industry (two-digit SIC) fixed effects. The sample consists of newly appointed CEOs of Execucomp firms for which CEO profile data are available from BoardEx in the 1993-2007 period. Variable definitions are provided in Table A1 in the Appendix. Robust t-statistics adjusted for firm-level clustering are reported in brackets. *, ${ }^{* *}$, ${ }^{* * *}$ indicates significance at the $10 \%, 5 \%$ and $1 \%$ levels.

|  | (1) | (2) | (3) | (4) | (5) | (6) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Distress Firm |  | M\&A Activity |  | Industry Shocks |  |
|  | Yes | No | High | Low | High | Low |
| General Ability Index Dummy | 0.225*** | 0.130** | 0.226*** | 0.150*** | 0.438*** | 0.060 |
|  | [2.982] | [2.323] | [3.124] | [2.754] | [4.280] | [0.629] |
| Observations | 522 | 743 | 402 | 863 | 283 | 348 |
| R-squared | 0.612 | 0.586 | 0.645 | 0.512 | 0.648 | 0.599 |

## Table 12

Generalist excess pay and general managerial ability
This table presents estimates of OLS and firm fixed effects panel regressions of the generalist excess pay on the number of industries a CEO worked, a dummy that takes the value of one if a CEO worked in more than one industry (multi-industry dummy), the general ability index, and a dummy variable that takes the value of one if the general ability index is above the yearly median. The generalist excess pay is defined as the logarithm of the ratio of the CEO total pay to its imputed pay from single-industry CEOs that match the CEO's past industry (four-digit SIC) experience. The regressions include the same firm-level control variables as in Table 5 (coefficients not shown). The regressions also include year and industry (two-digit SIC) fixed effects. The sample consists of Execucomp firms for which CEO profile data are available from BoardEx in the 1993-2007 period. Variable definitions are provided in Table A1 in the Appendix. Robust tstatistics adjusted for firm-level clustering are reported in brackets. *, ${ }^{* *}$, ${ }^{* * *}$ indicates significance at the $10 \%, 5 \%$ and $1 \%$ levels.

|  | (1) | (2) | (3) | (4) | (5) | (6) | (7) | (8) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | OLS | Firm Fixed Effects | OLS | Firm Fixed Effects | OLS | Firm Fixed Effects | OLS | Firm Fixed Effects |
| Number of Industries | $\begin{array}{r} \hline 0.055 * * * \\ {[5.050]} \end{array}$ | $\begin{gathered} \hline 0.019 * * \\ {[2.308]} \end{gathered}$ |  |  |  |  |  |  |
| Multi-Industry Dummy |  |  | $\begin{gathered} 0.144^{* * *} \\ {[4.610]} \end{gathered}$ | $\begin{array}{r} 0.035 \\ {[1.395]} \end{array}$ |  |  |  |  |
| General Ability Index |  |  |  |  | $\begin{array}{r} 0.106 * * * \\ {[6.573]} \end{array}$ | $\begin{array}{r} 0.040^{* * *} \\ {[2.834]} \end{array}$ |  |  |
| General Ability Index Dummy |  |  |  |  |  |  | $\begin{gathered} 0.153^{* * *} \\ {[5.381]} \end{gathered}$ | $\begin{array}{r} 0.090^{* * *} \\ {[3.880]} \end{array}$ |
| Observations | 12,765 | 12,765 | 12,765 | 12,765 | 12,765 | 12,765 | 12,765 | 12,765 |
| R-squared | 0.338 | 0.670 | 0.336 | 0.670 | 0.341 | 0.670 | 0.337 | 0.671 |

## Table 13

## Firm performance and general managerial ability

This table presents estimates of firm fixed effects and changes regressions of net profit margin, return on equity (ROE), Tobin's $Q$ and stock return on the general ability index. The changes regressions use the subsample of newly-appointed CEOs and compare the average firm performance in the three years following an appointment with the performance on the year before the appointment. The regressions include the same CEO- and firm-level control variables as in Table 5 (coefficients not shown). The regressions also include year and industry (two-digit SIC) fixed effects. The sample consists of Execucomp firms for which CEO profile data are available from BoardEx in the 1993-2007 period. Variable definitions are provided in Table A1 in the Appendix. Robust t-statistics adjusted for firm-level clustering are reported in brackets. *, **, *** indicates significance at the $10 \%, 5 \%$ and $1 \%$ levels.

|  | (1) | (2) | (3) | (4) | (5) | (6) | (7) | (8) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Net Profit Margin |  | ROE |  | Tobin's Q |  | Stock Return |  |
|  | Firm Fixed Effects | Changes | Firm Fixed Effects | Changes | Firm Fixed Effects | Changes | Firm Fixed Effects | Changes |
| General Ability Index | -0.005 | -0.005 | -0.003 | 0.000 | -0.005 | -0.022 | -0.008 | 0.005 |
|  | [-0.907] | [-0.373] | [-1.458] | [0.029] | [-0.403] | [-0.402] | [-1.104] | [0.234] |
| Observations | 12,986 | 1,097 | 12,986 | 1,097 | 12,791 | 1,148 | 12,791 | 1,084 |
| R-squared | 0.355 | 0.105 | 0.655 | 0.140 | 0.770 | 0.121 | 0.470 | 0.204 |

## Table 14

## CEO turnover and general managerial ability

This table presents estimates of probit regressions of CEO turnover on the general ability index and firm performance. The measures of performance are return on assets (ROA), industry-adjusted return on assets (industry adjusted ROA), stock return, and stock return minus the value-weighted stock market return (abnormal stock return). The regressions also include year and industry (two-digit SIC) fixed effects. The sample consists of Execucomp firms for which CEO profile data are available from BoardEx in the 1993-2007 period. Variable definitions are provided in Table A1 in the Appendix. Robust t-statistics adjusted for firm-level clustering are reported in brackets. ${ }^{*},{ }^{* *},{ }^{* * *}$ indicates significance at the $10 \%, 5 \%$ and $1 \%$ levels.

|  | (1) | (2) | (3) | (4) |
| :---: | :---: | :---: | :---: | :---: |
| General Ability Index | 0.075*** | 0.095*** | 0.109*** | 0.108*** |
|  | [4.547] | [7.258] | [7.813] | [7.848] |
| General Ability Index $\times$ ROA (t-1) | 0.227* |  |  |  |
|  | [1.739] |  |  |  |
| General Ability Index $\times$ Industry Adjusted ROA (t-1) |  | 0.158 |  |  |
|  |  | [1.105] |  |  |
| General Ability Index $\times$ Stock Return (t-1) |  |  | -0.005 |  |
|  |  |  | [-0.168] |  |
| General Ability Index $\times$ Abnormal Stock Return (t-1) |  |  |  | -0.012 |
|  |  |  |  | [-0.358] |
| Sales (log) | 0.040*** | 0.039*** | 0.019** | 0.018** |
|  | [4.542] | [4.471] | [2.075] | [1.997] |
| ROA (t-1) | -0.885*** |  |  |  |
|  | [-6.170] |  |  |  |
| Abnormal ROA (t-1) |  | -0.890*** |  |  |
|  |  | [-5.987] |  |  |
| Stock Return (t-1) |  |  | -0.211*** |  |
|  |  |  | [-6.308] |  |
| Abnormal Stock Return (t-1) |  |  |  | -0.238*** |
|  |  |  |  | [-6.635] |
| Observations | 18,575 | 18,575 | 16,741 | 16,741 |
| Pseudo R-square | 0.024 | 0.024 | 0.024 | 0.024 |



Fig. 1. CEO pay and general ability index. This figure presents the average general ability index and CEO total pay per year from 1993 to 2007. The sample consists of Execucomp firms for which CEO profile data are available from BoardEx. Variable definitions are provided in Table A1 in the Appendix.

## Table A1

Variable definitions

| Variable | Description |
| :---: | :---: |
| Panel A: CEO Compensation |  |
| Total Pay | Total CEO pay in thousand \$, which consists of salary, bonus, value of restricted stock granted, value of options granted, longterm incentive payout, and other compensation (Execucomp TDC1). |
| Cash Pay | Salary plus bonus in thousand \$ (Execucomp TOTAL_CURR). |
| Equity Pay | Value of restricted stock granted plus value of options granted in thousand \$ (Execucomp RSTKGRNT + OPTION_AWARDS_BLK_VALUE). |
| Pay Mix | Ratio of equity pay to total pay. |
| Generalist Excess Pay | Difference between CEO total pay and the imputed pay from single-industry CEOs who match the CEO's past industry experience. The imputed pay is the average pay of the portfolio of industries where the CEO worked where the industry-level pay is the median pay of CEOs who worked only in one industry up to a given year (single-industry CEOs). |
| Panel B: CEO Characteristics |  |
| General Ability Index | First factor of applying principal components analysis to five proxies of general managerial ability: past number of positions, number of firms, number of industries, CEO experience, and conglomerate experience (BoardEx). |
| General Ability Index Dummy | Dummy variable that takes a value of one if the CEO's general ability index is above the yearly median, and zero otherwise (BoardEx). |
| Number of Positions | Number of positions CEO has had based on past work experience in publicly traded firms (BoardEx). |
| Number of Firms | Number of firms where CEO has worked based on past work experience in publicly traded firms (BoardEx). |
| Number of Industries | Number of industries (four-digit SIC) where CEO has worked based on past work experience in publicly traded firms (BoardEx). |
| Multi-Industry Dummy | Dummy variable that takes a value of one if the number of industries (four-digit SIC) where CEO has worked based on past work experience in publicly traded firms is greater than one, and zero otherwise (BoardEx). |
| CEO Experience Dummy | Dummy variable that takes a value of one if CEO held a CEO position at another company based on past work experience in publicly traded firms, and zero otherwise (BoardEx). |
| Conglomerate Experience Dummy | Dummy variable that takes a value of one if CEO worked at multi-segment company based on past work experience in publicly traded firms, and zero otherwise (BoardEx). |
| CEO Age | Age of CEO in years (BoardEx). |
| CEO Tenure | Number of years as CEO in the current position (BoardEx). |
| External Hire Dummy | Dummy variable that takes a value of one if CEO was hired from outside the firm, and zero otherwise (BoardEx). |


| MBA Dummy | Dummy variable that takes a value of one if CEO has a MBA degree, and zero otherwise (BoardEx). |
| :--- | :--- |
| CEO-Chair Dummy | Dummy variable that takes a value of one if CEO is also chair of the board, and zero otherwise (BoardEx). |
| First Year as CEO Dummy | Dummy variable that takes a value of one if CEO is in the first year of the job, and zero otherwise (BoardEx). |
| Ivy League Dummy | Dummy variable that takes a value of one if CEO attended an Ivy League school (Brown University, Columbia University, <br> Cornell University, Dartmouth College, Harvard University, Princeton University, University of Pennsylvania, and Yale <br> University) at any academic level, and zero otherwise (BoardEx). <br> Dummy variable that takes a value of one if the CEO graduated (first academic degree) in an NBER recession year, and zero <br> otherwise (BoardEx). |
| Recession Graduate Dummy |  |
| Fage at which CEO became CEO for the first time (BoardEx). |  |


| CAPEX | Capital expenditures divided by total assets (CAPX / AT). |
| :--- | :--- |
| Net Profit Margin | Net income divided by sales (Compustat NI / SALE). |
| ROE | Net income divided by total assets (Compustat NI / AT). |
| Board Independence | Ratio of number of independent directors to board size (IRRC). |
| Institutional Ownership | Herfindahl index calculated as the sum of squared institutional ownership (Thomson CDA/Spectrum 13F Holdings). |
| Herfindahl | Governance index of Gompers, Ishii, and Metrick (2003), which is based on 24 antitakeover provisions (IRRC). |
| GIM Governance Index | Herfindahl index calculated as the sum of squared market shares of firms' sales (Compustat SALE) at the two-digit SIC industry <br> Industry Sales Herfindahl <br> level. |
| Distress Firm Firms with ROA below the industry median (two-digit SIC) for two consecutive years (Compustat). <br> M\&A Activity Value of acquisitions (Compustat AQC). <br> Industry Shocks Difference between industry (two-digit SIC) sales growth and average sales growth across all industries (Compustat). |  |

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[^1]:    *We thank for helpful comments an anonymous referee, Ilona Babenko, Jeff Coles, Alex Edmans, Carola Frydman, Charles Hadlock, Todd Milbourn, Kevin J. Murphy, Oguzhan Ozbas, Bill Schwert (the editor), Albert Sheen, Laura Starks, René Stulz, Marie Sushka, and Yuhai Xuan; participants at the 2011 SFS Finance Cavalcade and 2012 American Finance Association meetings; and seminar participants at Arizona State University, Nova School of Business and Economics, Ohio State University, and University of Oregon.
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[^2]:    ${ }^{1}$ Becker (1962) is the first to have made the distinction between general human capital that increases productivity not only at one firm but also at other firms, and firm-specific human capital that increases worker productivity at the current firm but not elsewhere. A broader approach assumes all skills are general but firms use them with different weights (Lazear (2009)).

[^3]:    ${ }^{2}$ Ferreira and Sah (2012) propose a model where more generalist managers tend to occupy the top of the hierarchy as the complexity of the business environment increases and communication technologies improve.

[^4]:    ${ }^{3}$ Garvey and Milbourn (2003) and Milbourn (2003) also link CEO pay, pay-performance sensitivities, and relative performance evaluations to CEO characteristics such as age, wealth, and media coverage. Another line of research links CEO pay level and structure to CEO physical and personality traits (Graham, Harvey, and Puri (2010)).
    ${ }^{4}$ Others have shown that managers' fixed effects and measurable characteristics have significant explanatory power for corporate financial policies and performance (Bertrand and Schoar (2003), Kaplan, Klebanov, and Sorensen (2012), and Malmendier, Tate, and Yan (2011)). Fee, Hadlock, and Pierce (2010), however, find no evidence of a managerial style effect using a sample of exogenous CEO turnovers.

[^5]:    ${ }^{5}$ The CEO profiles missing in BoardEx are mainly from executives who retired or died before 2000. In untabulated results, we find that primary findings are robust when we use the 2000-2007 sample period.

[^6]:    ${ }^{6}$ In unreported results, we obtain similar findings when we count the number of industries at the two-digit SIC level.

[^7]:    ${ }^{7}$ An eigenvalue above one means that the extracted component has more explanatory power than any one of the original proxies by itself. The eigenvalue of the second factor is less than one.
    ${ }^{8}$ The general ability index data used in this paper is online at http://jfe.rochester.edu/data.htm.

[^8]:    ${ }^{9}$ In unreported results, we obtain similar findings when we classify CEOs with an index above the overall median as generalists.
    ${ }^{10}$ Analysis of the average generalist excess pay over time in Table 2 is restricted to the sample of multi-industry CEOs. Thus, the measure is simply capturing how much more (or less) a generalist earns compared to an otherwise equivalent portfolio of specialists.

[^9]:    ${ }^{11}$ Results (untabulated) with t-statistics adjusted for within-CEO correlation are similar to those with t-statistics adjusted for within-firm correlation.
    ${ }^{12}$ A CEO can change from the generalist to the specialist group because we use the yearly median to define the groups.

[^10]:    ${ }^{13}$ A caveat of this approach is that we cannot rule out selection based on directors' private information. We minimize this possibility by using specifications that control for unobserved firm heterogeneity.

[^11]:    ${ }^{14}$ We obtain consistent results if we use pay of the year following the CEO appointment.

[^12]:    ${ }^{15}$ There is evidence that generalist CEOs perform better than specialist CEOs in diversified firms. Xuan (2009) finds that appointment of specialist CEOs in multi-division firms leads to inefficient capital allocation decisions.
    ${ }^{16}$ We obtain similar findings using the level of institutional ownership or number of firms in the industry to rank firms in low and high groups.

[^13]:    ${ }^{17}$ In the case of a single-industry CEO, the excess pay measure is simply the difference between the CEO total pay and the median pay of single-industry CEOs in the industry.

[^14]:    ${ }^{18}$ An alternative explanation for the statistical insignificant relation between firm performance and the general ability index is that performance is endogenous and our tests lack power.
    ${ }^{19}$ We obtain similar findings when we consider only forced CEO turnovers. We thank Dirk Jenter for providing us with the forced CEO turnover data, used in Jenter and Lewellen (2010).

[^15]:    ${ }^{20}$ We obtain similar finding when we estimate the marginal effect of the general ability index and firm performance interaction and its significance using the delta method described by Ai and Norton (2003).
    ${ }^{21}$ Gabaix and Landier (2008) offer a calibration of their model where firm value will go up by only $0.016 \%$ if the CEO number 250 (in terms of talent) is replaced by the number one CEO.

