

LEARNING TO LEAD: A QUASI-EXPERIMENTAL TEST OF THE INTERPLAY
BETWEEN EXPERIENCE AND TRAINING

A DISSERTATION
SUBMITTED TO THE FACULTY OF THE
UNIVERSITY OF MINNESOTA
BY

STEPHEN L. JONES

IN PARTIAL FULFILLMENT OF THE REQUIREMENTS
FOR THE DEGREE OF
DOCTOR OF PHILOSOPHY

ANDREW H. VAN DE VEN, ADVISOR

JULY 2015

© Stephen Jones 2015

Acknowledgements

I express my deepest gratitude to my dissertation committee: Andy Van de Ven, Pri Shah, Gurneeta Singh, Harry Sapienza, and Bryan Dowd. I read Andy's book, *Engaged Scholarship*, in the first year of my Ph.D. program. It rang true to me. I wanted to be an engaged scholar able to impact both theory and practice. Over the next four years Andy mentored me and showed me by example what it means to be engaged. He invited me on multiple company visits. I discovered the important difference between being an engaged scholar and a consultant. I also discovered that Andy's success in engaged scholarship is inextricably tied, I believe, to his graciousness and good nature. His guidance was invaluable as I developed the relationship with my research site.

Pri played a critical role as I designed my study. Her counsel on survey design and measurement was prescient: it aided in capturing some of the most insightful findings in this study. She also provided valuable suggestions for framing the study and for making a contribution to the field. Moreover, her belief in me buoyed me up through difficult days, which are so common in the process of writing a dissertation.

Gurneeta's insightful criticism always motivated me to create my best work. She helped me see the blind spots in my arguments and provided helpful guidance.

Harry also provided insightful criticism and provided guidance for thinking with precision about constructs, hypotheses, and underlying mechanisms. I will always fondly remember our discussions that seemingly generated a hundred research ideas with every conversation.

I am grateful for Bryan's instruction in statistical methods which has impacted this study and the analysis of nearly every paper I have written.

I also wish to thank Martin Ganco who provided valuable advice early on in the design of this study, Michael Cummings who was an ad hoc reviewer of my work, and Amie Norden who provided insights into training methods. I also wish to thank my partners within the Learning and Development team at the research site who provided access and support from within.

Dedication

To Claire, whose unfailing support, encouragement, and faith in my capacity have sustained me through my Ph.D. program.

Abstract

Two dominant ways that employees learn leadership skills are formal training and on-the-job experience. Both types of learning are ubiquitous in organizations, but their interplay is rarely considered. In this study, I adopt learning theories from educational and cognitive psychology to explain why experience may help or hinder the effectiveness of leadership training, and I test my hypotheses using a quasi-experiment in a public accounting firm. I also examine the impact of other individual differences—cognitive ability, motivation to lead, learning goal orientation, and pre-training self-efficacy—on training effectiveness.

From the perspective of the leader, prior leadership experience significantly improved the effectiveness of leadership training. Leaders who had led more projects and had been exposed to a broader range of leadership situations were those who benefited the most from leadership training. The results support the theory that cognitive constraints impede learning during training for novice leaders and are alleviated when leaders possess more experience. However, the same support was not found from the manager and subordinate perspectives.

Regarding individual differences, there was clear evidence for the benefit of a learning goal orientation, mixed evidence for the benefit of motivation to lead, very limited evidence for self-efficacy, and no evidence for cognitive ability. The implications of these findings for theory and practice are discussed.

Table of Contents

List of Tables	v
List of Figures	vi
1. Introduction.....	1
2. Theory and Hypotheses.....	5
Experience and Training as Modes of Learning	5
Leadership Training	5
Moderating Impact of Experience	7
Moderating Impact of Other Individual Characteristics	11
3. Methodology	17
Research Setting	17
Training Manipulation	17
Research Design	18
Variables	20
Sample	24
Analytic Approach.....	32
4. Results.....	37
Descriptive Statistics.....	37
Leader Perspective	40
Subordinate Perspective.....	54
Manager Perspective.....	59
5. Discussion.....	64
The Interplay between Experience and Training	64
Other Important Individual Characteristics.....	66
Implications for Theory	67
Implications for Practice	69
Limitations	69
6. Bibliography	71
7. Appendix A: Survey Items.....	81
8. Appendix B: Large Tables	90

List of Tables

Table 1. Leader, subordinate, and manager samples.	25
Table 2. Nonresponse comparisons.	29
Table 3. Nonrandom group comparisons.	31
Table 4. Selected descriptive statistics.	38
Table 5. Selected bivariate correlations: leadership behaviors.	39
Table 6. Selected bivariate correlations: leader characteristics.	40
Table 7. Relationship between moderators and base (week 0) leadership behaviors.	40
Table 8. Main effect of training: leader perspective.	42
Table 9. Moderating effects entered individually: leader perspective.	43
Table 10. All moderating effects: leader perspective.	44
Table 11. Three-way interaction with opportunity to lead: leader perspective.	47
Table 12. Alternative lagged DV models: leader perspective.	52
Table 13. Main effect of training: subordinate perspective.	55
Table 14. Moderating effects entered individually: subordinate perspective.	56
Table 15. Main effect of training: manager perspective.	61
Table 16. Moderating effects entered individually: manager perspective.	62
Table 17. All moderating effects: manager perspective.	63
Table 18. Summary of findings.	65
Table 19. CFA for time-varying constructs (measured at multiple time periods).	90
Table 20. CFA for time-invariant constructs (measured only once).	91
Table 21. Means and standard deviations.	93
Table 22. Bivariate correlations.	95

List of Figures

Figure 1. Constraint on learning in training from underdeveloped schemata.....	8
Figure 2. Ceiling constraint on learning in training.....	9
Figure 3. Learning in training.....	10
Figure 4. Research design.....	19
Figure 5. Number of project leaders rated, by perspective.....	27
Figure 6. Project leader audit vs. tax.....	28
Figure 7. Number of projects led.....	32
Figure 8. Leadership behaviors over time: leader perspective.....	41
Figure 9. Predicted effect of training and experience (projects led).....	46
Figure 10. Predicted effect of training, experience (breadth), and opportunity to lead.....	48
Figure 11. Predicted effect of training and learning goal orientation.....	50
Figure 12. Leadership behaviors over time: subordinate perspective.....	54
Figure 13. Retrospective change in leadership behaviors: manager rating.....	60

1. INTRODUCTION

Informal, on-the-job experience and formal training are two ubiquitous modes of learning in organizations. Both are integral for managerial and employee development, and they may interact in important ways. However, we know surprisingly little about the interplay between experiential learning and formal training. Both are concerned with the development of knowledge and skill, yet they are usually treated separately in both research and practice. The organizational learning literature primarily focuses on various forms of experiential learning—such as trial-and-error learning, improvisation, and indirect experience (Darr, Argote, & Epple, 1995; Levitt & March, 1988; Miner, Bassoff, & Moorman, 2001)—with little regard to training. On the other hand, the training and development literature builds on educational models with formalized learning objectives and instructional methods (Craig, 1996) but pays little attention to employee experience. In practical terms, training is often offered to employees whether or not their individual experiences have prepared them for learning (Taylor, 1998). Over two decades ago, Adler and Clark (1991) suggested that experience and training interact to impact training, but few researchers have taken up the topic since (exceptions are Bapna, Langer, & Mehra, 2013; Jentsch, Bowers, & Salas, 2001). Yet, there are reasons to believe that this interaction matters for learning in organizations. Educational and cognitive psychologists have argued that prior knowledge and experience fundamentally alter the way learners' encounter instruction (Bandura, 1986; Sweller, 2011; van Gog & Rummel, 2010). Their work suggests a crucial role for experience when learning through training.

To explore this interplay, I focus on learning to lead. Leadership is fundamental to organizational functioning, and it is an apposite knowledge domain for the question at hand. Leadership abilities include explicit behaviors and interaction patterns that can be molded through training (Collins & Holton, 2004) as well as deeper, nuanced capacities that are less structured and more tacit in nature (Janson & McQueen, 2007). The blended nature of leadership affords development through both experience and training. With leadership as the knowledge context, I ask: *How does prior leadership experience impact the effectiveness of leadership training?*

Research that examines training effectiveness has focused on many trainee characteristics other than experience. Evidence suggests that cognitive ability (Kanfer & Ackerman, 1989; Ree & Earles, 1991), motivation (Chiaburu & Marinova, 2005; Colquitt & Simmering, 1998; Klein, Noe, & Wang, 2006), learning goal orientation (Ford, Smith, Weissbein, Gully, & Salas, 1998; Klein et al., 2006), and self-efficacy (Gist, Stevens, & Bavetta, 1991; Tracey, Hinkin, Tannenbaum, & Mathieu, 2001) impact training outcomes (Blume, Ford, Baldwin, & Huang, 2010; L. A. Burke & Hutchins, 2007; Colquitt, LePine, & Noe, 2000). Yet, these individual characteristics have only been studied in contexts where training is assumed to be necessary for learning. Those who receive training have not been compared to those who learn through on-the-job experience only. The concern is that the same characteristics that help individuals excel during training may also help them excel through their normal work experiences. Thus, the impact of individual characteristics on training outcomes may be overstated because the results have not been compared to a non-trained, experiential learning group. As part of this study, I also ask: *How does cognitive ability, motivation to lead, learning goal orientation, and self-efficacy impact the effectiveness of leadership training when trainees are compared to similar others who are not trained?*

To explore these questions, I conducted a quasi-experiment with employees in a U.S. accounting firm, which I call Partners in Public Accounting (PPA). PPA assigns employees to lead tax and audit projects when they reach about two years of experience in the company. Project leaders manage and mentor less-experienced coworkers. The treatment group was comprised of project leaders with virtually none to a few years of project leadership experience; they received a newly-developed leadership training module. The treated group attended a newly-developed leadership training session, and the control group was not trained during the study period. Learning was captured by measuring leadership behaviors both before and after training from the perspective of the leaders, their subordinates on the projects, and their managers. To gain a deeper understanding of experience, I conceptualized and measured it both as an accumulation over time and as a breadth and depth of exposure to leadership situations. Because the treatment was not randomized (the organization would not allow for randomization), I account for systematic causes of employees being in different groups.

I draw from the educational psychology, training, and organizational learning literatures to propose that greater experience will increase the benefit of training. That is, the training treatment will have greater impact on more-experienced trainees than on less-experienced trainees when compared to similarly experienced peers that are not trained. The benefit of experience for training, however, may subside at increasingly higher levels of experience. The premise is that experience

generates a corpus of prior knowledge and skill that allows trainees to better comprehend and integrate the training that is offered (van Gog & Rummel, 2010). Novice trainees are prone to miss important elements from training due to their lack of familiarity (Jentsch et al., 2001; Tuovinen & Sweller, 1999). Greater experience is beneficial only up to a point when other effects begin to operate that suppress its benefits. I also argue that training will be more useful to employees with greater cognitive ability, motivation to lead, learning goal orientation, and self-efficacy. That is, they will learn more than employees who are lower in these characteristics when compared to similar non-trained employees. Employees with these characteristics are apt to exploit the learning opportunities training affords—opportunities not present in their proximate work environment.

This study contributes to our understanding of *when* training is most effective, which is an important theoretical point. Existing theory does not address the appropriate timing of training in view of learners' experience levels. The study disentangles contrasting arguments for why experience may help or hinder training effectiveness, and it reveals the importance of accounting for prior experience. It also advances our understanding of four individual characteristics—cognitive ability, motivation to lead, learning goal orientation, and self-efficacy—thought to be important for training effectiveness. It takes these individual characteristics, which have been primarily tested in laboratory settings, and considers whether their influence is found in a field setting compared to a non-trained control group.

This study also provides important insights for training practices in organizations. It is estimated that U.S. organizations spend over \$150 billion on learning and development (ASTD, 2012); the U.S. training industry is comparable in size to the U.S. logging or fishing industries (IBISWorld, 2014). Yet, training dollars are often spent with no accountability or indication of their effectiveness (Awoniyi, Griego, & Morgan, 2002; Collins & Holton, 2004; Stern, 2011). Further, organizations often do not know which employees will benefit from training, which has prompted persistent calls for more organizations to conduct “needs analysis” (Aguinis & Kraiger, 2009; Salas & Cannon-bowers, 2001). The study builds upon this call to action by revealing that neglecting to account for experience can lead to training insufficiently experienced employees and managers who are apt to realize little benefit from the training. Many training dollars likely provide no return because individuals are ill-prepared in terms of their experience.

This study serves as a first step in understanding the interplay between experience and training, and it constitutes an initial effort to create a coherent picture of an individual's development through both informal, on-the-job experiences and formal training. It also serves to better integrate experiential learning and training literatures, which have developed separately in

the past. Moreover, the study will help further our understanding of important individual characteristics that impact training in an authentic leadership setting.

2. THEORY AND HYPOTHESES

Experience and Training as Modes of Learning

There are multiple modes through which individuals and organizations learn (Aguinis & Kraiger, 2009; Argote, 2013; Dragoni, Tesluk, Russell, & Oh, 2009; Huber, 1991; Kram & Isabella, 1985; Lave & Wenger, 1991). I focus on on-the-job experience and formal training because, while they are ubiquitous in organizations, they are not jointly understood. Formal training includes classroom-based, online, or self-paced formal instruction (Aguinis & Kraiger, 2009; DeRouin, Fritzsche, & Salas, 2004). Formal training's defining distinction is that individuals set aside work activities for preprogrammed instruction created by experts in the knowledge domain. Formal training aims to develop attitudes, cognitive understanding, or procedural skills that can be utilized at work (Kraiger, Ford, & Salas, 1993). Thus, transfer of training to the work context is a primary concern (Blume et al., 2010).

On-the-job experience, on the other hand, is not concerned with transfer because it is, *ipso facto*, applied to the work setting. Learning through on-the-job experience is a process of reflecting on the results of past actions and adjusting future behaviors to improve future results (Cyert & March, 1963; Gavetti & Levinthal, 2000; Kolb, 2014). With learning born of personal experience, the quality of experiences and nature of reflection become paramount (Dragoni et al., 2009; Kolb, 2014). On-the-job experiences may be guided by quasi-formal training through apprenticeships or mentoring as well (Chao, 1997; Lave & Wenger, 1991); however, apprenticeship and mentoring learning modes are beyond the scope of this study.

Leadership Training

In this project I adopt a skills-based view of leadership, which is apropos for this topic and context. Following the tradition of the classic Ohio State leadership studies, I view leadership as a set of behaviors practiced by leaders that relate to tasks and relationships (Halpin & Winer, 1957; Yukl, Gordon, & Taber, 2002). Leadership learning is theorized as a change in leadership behavior from one time point to the next. Conceptualizing learning as a behavioral change is common for studies

of learning in organizational settings (Argote, 2013). Leadership training can lead to changes in leadership behaviors as it has the potential to change the attitudes, knowledge, and skills of leaders, which result in on-the-job differences.

Classroom-based job training began with the industrial revolution, but its ascendance as a learning method came with the rise of scientific management and the exigencies of World War I & II (Sleight, 1993). Since that time, leadership training has been broadly implemented by organizations. The systematic investigation of leadership training began in the 1960s. In 1968, Hand and Slocum (1972) provided a training course to a randomized group of managers at a Pennsylvania steel mill. Eighteen months later, the trained managers demonstrated significantly better leadership behaviors than the non-trained managers. Since that time, many studies have shown positive effects of management training in manufacturing (Burnaska, 1976; Earley, 1987; Latham & Saari, 1979; Sorcher & Spence, 1982), health care (Wexley & Nemeroff, 1975), retail banking (Barling, Weber, & Kelloway, 1996; Mathieu & Leonard, 1987), insurance sales (Frayne & Geringer, 2000), pharmaceutical (Morrow, Jarrett, & Rupinski, 1997), military (Dvir, Eden, Avolio, & Shamir, 2002), and restaurant (Tews & Tracey, 2008) contexts. The degree of positive findings led Aguinis and Kraiger (2009, p. 452) to proclaim in their review that “training in work organizations produces clear benefits for individuals... teams, [and] organizations.”

Many leadership trainings use behavioral modeling techniques, which are rooted in Bandura’s social learning theory (Bandura, 1977, 1986). Bandura theorized that individuals act based on their symbolic framing of environmental influences, which allows them to learn through observation. Thus, individuals do not only learn through their own experiences, but they also learn vicariously through the experiences of others (Bandura, 1986). Behavioral modeling provides examples of effective and ineffective behavior and shows the good and bad consequences of the behaviors (Taylor, Russ-Eft, & Chan, 2005).

Social learning theory is frequently cited as the reason for a training’s impact (Latham & Saari, 1979; Sorcher & Spence, 1982), but social learning theory alone does not sufficiently explain why training may improve learning beyond that gained through on-the-job experience. On-the-job experience includes learning not only from one’s own work experiences but also vicariously by observing proximate superiors, peers, and subordinates. Experiential learning does not occur in a vacuum; behavioral modeling naturally occurs in work settings too. So why would it not lead to the same learning outcomes as training? To help explain why, I adopt ideas from organizational theory.

It is helpful to view individuals' leadership responsibilities as a suite of problems that require solutions (Nickerson & Zenger, 2004). Individuals search for solutions to problems when current solutions are missing or lead to inferior performance (Cyert & March, 1963). Searching for solutions is often a task of observing others who model superior behaviors. With the demands of everyday responsibilities, individuals are limited in the scope of their search for solutions to proximate coworkers. An individual's on-the-job learning constitutes a local search for behavioral models (Gavetti & Levinthal, 2000). Training provides an opportunity for individuals to observe behavioral solutions that are not likely visible in the local search space. In this way, training improves learning by providing access to superior models that might not have been found otherwise. Social learning theory, then, can explain the effectiveness of leadership training inasmuch as the behavioral models shown in training are superior and not readily accessible outside of training. In the case of training project leaders, the training will likely expose employees to leadership solutions they have not observed in their proximate work context. Project leaders will gain new insights that they can apply directly to their work, which should be visible to both them, their subordinates, and their managers.

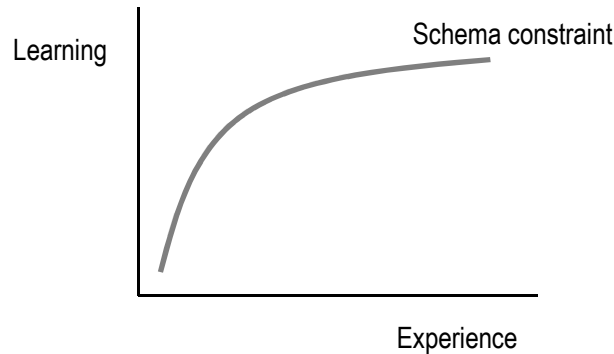
Hypothesis 1 (H1): Trained project leaders will improve in their leadership behaviors more than non-trained project leaders, as judged by (a) themselves, (b) their subordinates, and (c) their managers.

Moderating Impact of Experience

There are two contrasting arguments for why greater experience may help or hinder learning from training. On the one hand, experience may increase learning because it serves as a base of understanding on which training can build. On the other hand, experience may also decrease learning because experienced trainees have less to learn. These two explanations can be reconciled by viewing them as constraints on learning that are manifest at different places on the experience continuum from novice to expert.

Cognitive load theory from educational psychology supports the first argument (Paas, Renkl, & Sweller, 2003; Schnotz & Kürschner, 2007; Sweller, 1988, 2011; Van Merriënboer & Sweller, 2005). It proposes that human cognitive architecture is divided into working memory and long-term memory. While working memory is severely limited in its capacity to process information, long-term memory has near unlimited capacity. In long-term memory, complex information is stored in mental schemata that serve as organizing frames and processing rules that can be utilized without conscious processing (Sweller, 2011). Mental schemata, which are

Figure 1. Constraint on learning in training from underdeveloped schemata.

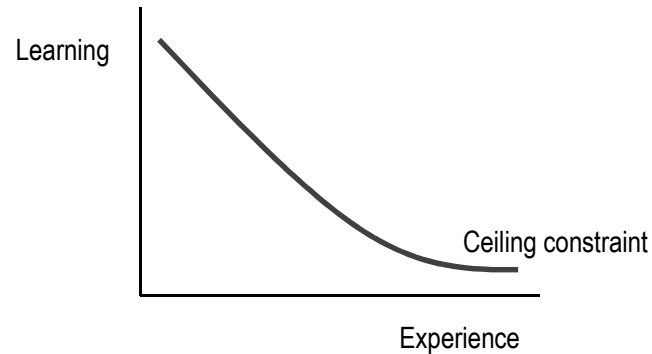


developed with experience, overcome the learning constraints imposed by working memory and demarcate experts from novices (Chi, Feltovich, & Glaser, 1981). Novices, then, are much more prone to experience cognitive overload, which hinders learning.

The insights from cognitive load theory are also found in social learning theory (van Gog & Rummel, 2010). Both theories explicate learning from others, with cognitive load theory focused on direct instruction and social learning theory focused on observation (Bandura, 1986; cf. Van Merriënboer & Sweller, 2005). Social learning theory explains that individuals are better able to capture the important elements of behavioral models when they have had some exposure to those elements in the past. Prior knowledge provides a frame for deciphering subtle cues. When prior knowledge is lacking, learning is more likely to be fragmentary or even misguided. Modeled behavior is a complex form of instruction, and novices have difficulty discerning meaningful elements of behavior from behavioral elements that are merely distractions. They are also less likely to detect errors, which can lead to adopting faulty behaviors (Bandura, 1986; van Gog & Rummel, 2010).

The importance of prior knowledge for assimilating new knowledge is also foundational to the organizational concept of absorptive capacity (Cohen & Levinthal, 1990). Absorptive capacity builds on cognitive research at the individual level that recognizes the importance of mental categorization and association to develop understanding as well as the necessity of building a corpus of knowledge to give conceptual meaning to language (Bower & Hilgard, 1981; Lindsay & Norman, 1977).

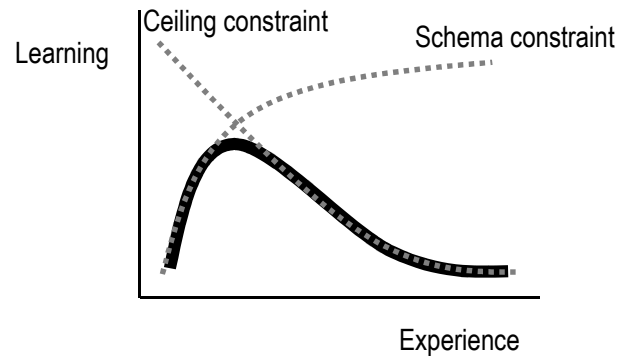
Figure 2. Ceiling constraint on learning in training.



These theories suggest that trainees with greater prior knowledge will be better able to learn from training. Those lacking experience will learn less because of inadequate mental schemata. Thus, a *schema constraint* acts as the essential limitation. It is likely that this constraint is most pressing for very inexperienced learners (Jentsch et al., 2001). The constraint may quickly lessen as learners construct rudimentary mental schemata, and it may continue to subside with greater experience. The schema constraint is depicted in Figure 1.

The second argument is supported by the simple notion that those with greater knowledge have less to learn from training. In essence, the learning objectives and topics covered in training act as a ceiling such that it is difficult to learn more than is taught. The amount of learning possible is a function of what is currently known by an individual and what the training teaches. As the distance between these two variables decreases, so does the amount of potential learning. Training may include much wasted time if learning objectives are too easy. This view is expressed by Schnotz & Kürschner (2007) who attribute non-learning among more-experience subjects in some laboratory experiments to educational manipulations that were too easy. The training ceiling may not be strictly rigid—trainees may create new ideas that inform behavior by associating or combining instruction and past experience in novel ways (Dyer, Gregersen, & Christensen, 2011)—but it would be difficult for any trainee to advance much beyond the given training level. Moreover, even if training is not objectively too easy, experienced trainees may perceive there is little to learn and engage less (Knowles, 1996). Inertial influences may create an unwillingness to change leadership behaviors. Based on this logic, Figure 2 displays a *ceiling constraint* that decreases learning as experience increases.

Figure 3. Learning in training.



The ceiling and schema constraints are always present, but one is more likely to be the limiting factor than the other at different locations on the experience continuum. Learning by novices is more likely to be limited by the schema constraint, whereas learning by experts is more likely to be constrained by the ceiling constraint, as shown in Figure 3. Learning is constrained to the area below the bold, dashed line. Given specific training objectives, experience increases learning potential up to a point after which learning potential declines.

For my research question, it is also important to consider learning rates among experience-only learners. For employees who are developing leadership behaviors solely based on on-the-job experiences, their development will likely follow a traditional learning curve. Psychologists and organization scholars have documented that learning improvements by individuals and organizations follow a power law (Argote, 2013). That is, performance in a specific domain improves at a decreasing rate with the accumulation of experience. The implication from learning curves is that while more experienced individuals systematically have higher performance, the rate of their learning is lower than those with less experience.

In sum, novice leaders may gain little additional learning from leadership training compared to non-trained novices. Only small gains are likely because novice leaders have much to gain simply through on-the-job practice and because they lack background experience that would help them learn in training. In contrast, training is likely to have a larger impact as employees gain more experience leading. The rate of learning through experience decreases as employees gain more experience, and, at the same time, they become better able to master behaviors taught in

training. The benefit of training will likely increase as experience increases up to the point at which the ceiling constraint for training takes effect. At that point the benefits of training for increased experience will no longer grow.

Because most project leaders in the sample had little leadership experience, the schema constraint is likely to play a larger role. If the sample included more seasoned leaders, then the ceiling constraint would likely come to bear. Given that leaders are fairly inexperienced, I posit:

Hypothesis 2 (H2): Greater prior leadership experience will amplify the effect of training on leadership behaviors as judged by (a) project leaders, (b) their subordinates, and (c) their managers.

Moderating Impact of Other Individual Characteristics

Four individual differences have demonstrated moderate to strong impacts on training outcomes: cognitive ability, motivation, learning goal orientation, and pre-training self-efficacy (Blume et al., 2010; L. A. Burke & Hutchins, 2007). In studies to date, these differences have been compared in training-only contexts. That is, training outcomes for those with higher levels of cognitive ability, motivation, and so forth are compared to training outcomes for those with lower levels. What is missing from existing research is an understanding of whether training is useful (meaning training increases learning beyond that obtained through on-the-job experience only) for different types of people—those with higher or lower cognitive ability, those with more or less motivation to lead, etc. Present empirical findings are important, and they address scenarios where training is essential or mandatory, such as learning to fly an airplane. However, many work contexts do not immediately call for training. While we may balk at flying with a novice pilot who has no formal training, we may be very willing to work under a new manager who has no leadership training. On-the-job experience in leadership may be as effective as leadership training for some types of individuals. As discussed above, a main, positive effect of conducting leadership training is quite robust, but it has not been analyzed in subpopulations. For instance, do both those with higher cognitive ability and those with lower cognitive ability benefit from attending training? Or do only those with higher (or lower) cognitive ability benefit? The question to be addressed is the moderating impact of these individual characteristics on training effectiveness. I briefly review below the theoretical reasoning for the effect of cognitive ability, motivation, learning goal orientation, and pre-training self-efficacy. I also briefly review empirical findings in training contexts and general work contexts. I then argue for and provide moderating hypotheses.

Cognitive Ability

Cognitive ability, general mental ability, or simply *g*, is regarded as a person's information processing or attentional capacity (Ackerman, 1988; Kanfer & Ackerman, 1989). It is theorized as the limit of one's working memory, and it can differ from one person to the next (Ackerman, 1988; Just & Carpenter, 1992; Kyllonen & Woltz, 1989). It is also considered a measure of one's ability to learn (Hunter, 1986), particularly for tasks that are beyond simple motor skills (Ackerman, 1988).

Cognitive ability has been associated with better training outcomes in many studies (Colquitt et al., 2000; Ree & Earles, 1991; Salas & Cannon-bowers, 2001). Training for new knowledge or skills places high demands on working memory; thus, those with greater cognitive capacity are apt to learn more from training (Colquitt et al., 2000). Cognitive ability is similarly predictive of job performance for the same theoretical reasons (Hunter, 1986). It is also predictive of leadership ability (Kickul & Neuman, 2000), though meta-analytic results show only a modest correlation (Judge, Colbert, & Ilies, 2004).

Motivation to Lead

Motivation research is concerned with why individuals select and regulate behaviors. Kanfer and Ackerman (1989) explain that motivation has a self-regulatory function when learning new things. It monitors and channels cognitive resources toward the task at hand. While cognitive ability defines the limits of attentional capacity, motivation determines the portion of that capacity that will be allocated to a learning task.

Motivation itself may be derived from the discovery of intrinsically rewarding activities or the cognitive choice to engage in an activity to pursue a valued outcome. Deci and Ryan's (1985, 1991; Ryan & Deci, 2000) self-determination theory has a strong emphasis on intrinsic motivation. It proposes that humans have innate capacities and preferences (i.e., the rudiments of mature personality) and intrinsic psychological needs for competence, autonomy, and affiliation. From young and throughout life, individuals interact with their environment and discover activities that afford them the opportunity to support these basic needs. These activities, which provide positive hedonic valence—meaning feelings of excitement, enjoyment, or delight—generate interest in the activity and become intrinsically motivating. Individual interests vary among people because of differences in their capacities and preferences as well as different social and environmental experiences (Deci, 1992). Interest creates a psychological state of “focused attention, increased cognitive functioning, persistence, and affective involvement” (Hidi, 2000, p. 311). Thus, interest

or intrinsic motivation can play an instrumental role in learning because of its self-regulatory function.

Other theories of motivation propose that individuals engage in behavior due to the value placed on the expected outcomes instead of the value of the behaviors themselves. In expectancy-value theories—Vroom's (1964) expectancy theory being the best known in organizational research—the choice to exert effort toward an activity is instrumental (Kanfer, 1990). If individuals estimate that their efforts will lead to certain performance outcomes (i.e., expectancy), and those outcomes hold personal value (i.e., valence), then they will decide to engage in the behavior (Colquitt & Simmering, 1998). Differences in effort among individuals can be due to differences in the value placed on likely outcomes or differences in the subjective perception that their efforts will lead to those outcomes. Although expectancy theory provides an alternate origin for motivation than self-determination theory, the importance of motivation as a self-regulatory function is comparable.

Existing research demonstrates a strong association between motivation and training outcomes (Colquitt et al., 2000). Tracey and colleagues (2001) found that motivation predicted learning outcomes in a sample of new managers trained in management skills. Importantly for this context, Chan and Drasgow (2001) also found a link between motivation to lead before training and leadership potential at the end of training for military recruits. Motivation and leadership behaviors have also been linked in non-training settings. Nursing managers in a U.S. hospital with higher motivation to achieve also demonstrated greater leadership behaviors (McNeese-Smith, 1999).

Learning Goal Orientation

Learning goal orientation and its companion, performance goal orientation, are concerned with achievement motivations. Goal orientation belongs to the field of motivation research (Kanfer, 1990), but it is considered separately from motivation to lead above because it focuses on specific dispositions that relate to the development of competence. Dweck (1986) introduced the two goal orientations through her research with school children. She found some children held learning goals to increase their competence and master new skills while others held performance goals to obtain positive evaluations of their competence and avoid negative evaluations. The important insight from her research is that individuals who hold learning goals (sometimes called a mastery orientation) seek challenge and enjoy exerting effort. However, those who hold performance goals will only exert effort if they expect that they can perform at a high level; if they believe they lack

ability, they will restrict their effort to avoid negative judgments. Students learn best when they are stretched beyond their current abilities, so those with performance goal orientations are more likely to under-engage in stretching tasks and to develop more slowly. An individual's goal orientation is a fairly stable (but malleable) disposition (Dweck & Leggett, 1988), so it can impact individual development over time.

Learning goal orientation has been associated with improved learning in training and regular work settings. Multiple studies in laboratory (Bell & Kozlowski, 2002; Ford et al., 1998) and classroom (Brett & VandeWalle, 1999; Brown, 2001; Klein et al., 2006; Schmidt & Ford, 2003) contexts have shown that a learning goal orientation improves training outcomes, though none directly looked at leadership. In regular work settings, learning goal orientation is related to learning in sales forces (VandeWalle, Brown, Cron, & Slocum, 1999) and, of more direct interest here, in leader-member exchanges (Janssen & Van Yperen, 2004). In a review of the goal orientation literature, Payne, Youngcourt, and Beaubien (2007) found that learning goal orientation was associated with self-regulatory and learning outcomes as well as job performance.

Self-Efficacy

Self-efficacy is a belief held about one's capabilities in a specific domain. It is derived from prior success, from observing successful role models, from the encouragement of others, and from affective states (Bandura, 1986). It too is an important concept in motivation, particularly for self-regulation (Kanfer, 1990), as it mediates a person's skill level and their actual behaviors. When individuals have low efficacy beliefs, they are much less likely to engage in an action. Self-efficacy is similar to expectancy in expectancy-value models of motivation. However, self-efficacy is a judgment of one's ability to perform a task (e.g., teach a class) whereas expectancy is a judgment of one's ability to achieve an outcome (e.g., get a high rating) from the performance of the task. As self-efficacy can change over time, I focus on self-efficacy held before training that may impact the effectiveness of training.

Like the other individual differences, self-efficacy is also tied to positive training outcomes. Self-efficacy has been shown to improve training motivation and has impact in a variety of settings (Bell & Kozlowski, 2002; Chiaburu & Marinova, 2005; Gist et al., 1991; Hughes et al., 2013; Tracey et al., 2001), though, again, most evidence does not consider leadership training directly. In the broader context of work, two meta-analytic reviews of self-efficacy and job performance have demonstrated mixed results. Stajkovic and Luthans (1998) found that self-efficacy is strongly associated to work outcomes for simpler tasks, but more difficult tasks have a

weaker association. Judge and colleagues (2007) found that self-efficacy and work performance had very little association when controlling for cognitive ability, Big 5 personality traits, and experience. While there are robust theoretical arguments for self-efficacy, its impact outside of training settings is ambiguous.

Moderation Hypotheses

The theoretical reasons for improved leadership ability described above apply equally well in training and on-the-job work settings, and empirical work generally supports them in both contexts. More motivated employees, for instance, can develop leadership capabilities faster than less motivated employees in training and through work experience. So will more motivated or less motivated employees benefit from leadership training? For employees with higher levels of cognitive ability, motivation to lead, learning goal orientation, and self-efficacy, I posit the answer is yes. As argued in Hypothesis 1, individuals have a limited scope of behavioral models available to them in their daily work. That leaves only their personal leadership experiences and the few examples near them to learn from. In any work position there may be plateau points at which little in the proximate environment offers no new examples from which to learn. Ericsson, Krampe, and Tesch-Römer (1993) explain that the quest for expert performance in nearly any area is filled with plateaus that are not overcome until new teachers or new feedback sources enter. When employees with higher levels of cognitive ability, motivation, etc., attend training, they are exposed to novel “best-practice” models of leadership that they can adopt. Training provides access to learning otherwise not available.

However, to benefit from training, employees must have sufficient ability and motivation to do so (Noe & Schmitt, 1986). Employees with lower levels of cognitive ability, motivation to lead, learning goal orientation, or self-efficacy are apt to face difficulties during leadership training. They are more likely to struggle to direct sufficient cognitive attention to learn the leadership behaviors. Thus, their growth in leadership skills may not be much greater than the growth of employees with similar low levels who receive no training. Using this logic, I posit the following:

Hypothesis 3 (H3): Greater cognitive ability will amplify the effect of training on improved leadership behaviors as judged by (a) project leaders, (b) subordinates, and (c) managers.

Hypothesis 4 (H4): Greater motivation to lead will amplify the effect of training on improved leadership behaviors as judged by (a) project leaders, (b) subordinates, and (c) managers.

Hypothesis 5 (H5): A stronger learning goal orientation will amplify the effect of training on improved leadership behaviors as judged by (a) project leaders, (b) subordinates, and (c) managers.

Hypothesis 6 (H6): Greater pre-training self-efficacy will amplify the effect of training on improved leadership behaviors as judged by (a) project leaders, (b) subordinates, and (c) managers.

3. METHODOLOGY

Research Setting

Partners in Public Accounting (a pseudonym) is a large public accounting firm headquartered in the United States. It has offices in over thirty states and over three thousand employees. PPA offers both tax and audit consulting services to government, non-profit and for-profit organizations in multiple industries. Accountants who have been with PPA four or less years attend a week-long (40-hour) training conference annually. Topics include tax regulations and rule changes, audit procedures, productivity software, and business skills. Employees physically meet at one location.

To better understand PPA's training program, I attended three different training conferences from October to December 2013. I observed sessions on individual, partnership, and non-profit taxation; auditing and audit software; and business writing. For a subset of classes I logged the time spent lecturing, asking and discussing questions, and working on case studies. I reviewed the materials for the sessions and spoke with teachers and participants during lunches and breaks. I also had multiple meetings with members of the Learning and Development team that organizes the training conferences.

To better understand the role of a project leader, I conducted nine interviews with six different individuals who were project leaders or managers with tax or audit experience. Interviews were semi-structured and were 45 to 60 minutes long. They included conversations concerning the role of training in skill development and the leadership behaviors needed to lead projects.

Training Manipulation

In the summer of 2014, PPA introduced a new leadership development session in its third-year training conference. The conference was held twice during summer: once in June with 125 participants (Trained Group 1) and once in July with 29 participants (Trained Group 2). The June conference was larger because a third conference was planned for later in 2014, but it was cancelled. All participants from the cancelled conference were moved to the June conference. Accountants that attended the third-year conference were at a career stage where they began to lead projects and assume responsibility to mentor less-experienced accountants. The purpose of the leadership

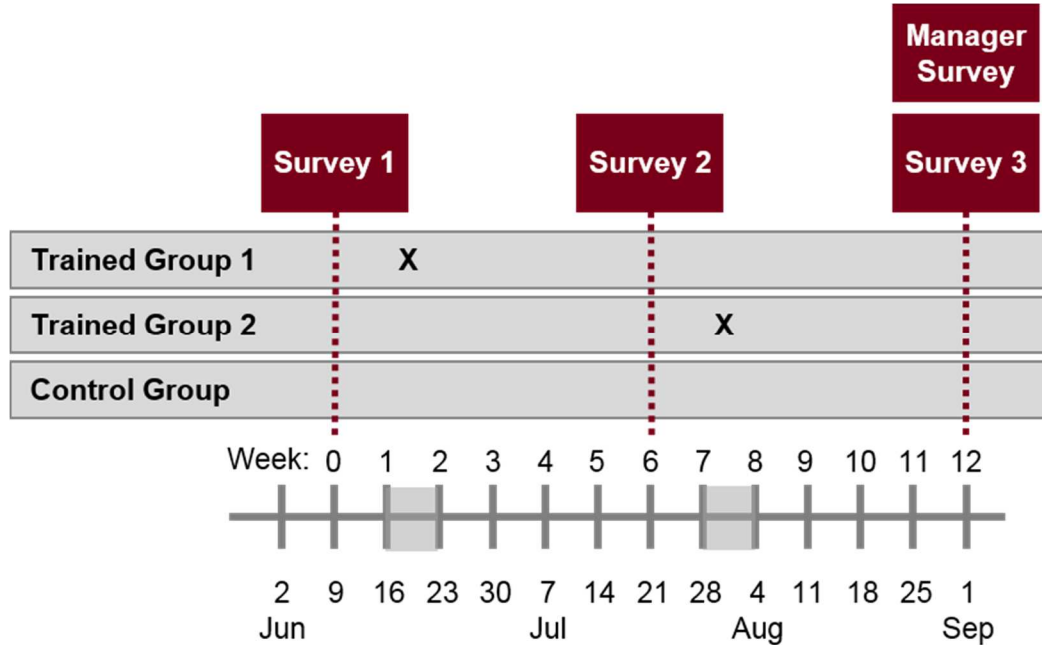
training was to improve the accountants' effectiveness in their new leadership role. The training was 3.5 hours long and occurred on the second day of the conference. I observed both the June and July sessions. The June conference was held at a hotel to accommodate the larger group and the July conference was held at PPA headquarters. The sessions occurred in one room with participants sitting at tables with 5-8 people per table. The training covered three topics: (1) how to effectively teach project staff on the job, (2) how to appropriately give feedback, and (3) how to mentor and provide effective work assignments. The June and July sessions were team-taught by the same two internal experts. Both sessions were taught using the same materials, in the same order, and following the same pedagogy. The instructors used behavioral modeling, discussions, lectures, and practice during the session. Instructors used PowerPoint during lecture portions and large flipcharts during discussion portions. For practice, participants received pre-populated Excel sheets on their laptops that simulated tax or audit project scenarios. The participants paired with partners to practice teaching and giving and receiving feedback. Participants were given handouts with a summary of the learning points.

Research Design

The study was designed as a replicated pretest and posttest with control group (Shadish, Cook, & Campbell, 2002). Figure 4 presents the treatment and control groups and research timeline. There were two trained groups (June at week 1 and July at week 7) and one control group. The treatment groups were those who enrolled in the training. I created a control group based on tenure data provided by PPA. Leaders in the treatment group had been with PPA between 1.5 and 3 years. I used this information to select similarly-tenured employees who were not in the June or July training to create the control group.

Leadership behavior ratings were collected from project leaders and subordinates in both the treatment and control groups in three survey waves six weeks apart from each other. The surveys were administered online, and all study project leaders and subordinates received the same survey (adjusted for their role as project leader or subordinate) in each survey period. The first wave was collected one week before the June training, which was the start of the study period (week 0), the second wave was collected five weeks after the June training and one week before the July training (week 6), and the third wave was collected five weeks after the July training (week 12). Participants in each group were asked to respond to all three surveys. Time-invariant characteristics were collected in the first survey (or the second if a person did not respond to the first). Because of limited access to manager time, I only surveyed managers once, asking them to

Figure 4. Research design.



retrospectively consider the change in a project leader’s leadership behaviors over the prior three months.

Treatment and control groups could not be randomized because of constraints within PPA. Yet, causal inferences can still be made if plausible threats to internal validity are identified and accounted for (Shadish et al., 2002). By using replicated treatments, pretests, and a control group, a broad swath of threats relating to natural growth and individual differences are dealt with. However, threats related to how an individual selects into a treatment or control group still remain. One benefit of this context is that all accountants are scheduled for training, not just those who appear to be promising leaders. Thus, concerns about selection due to higher skill or leadership potential are muted. The primary concern in this context is that individuals may choose when they train (e.g. during the summer or some earlier or later time), and that choice may make the treatment and control groups systematically different. I spoke with PPA managers to understand what factors impact selection into the treatment or control groups. Three factors emerged: hire quarter, industry assignment, and senior associate job level. The month an individual is hired can set the seasonal timing for their training—whether they train in the winter or summer. The industry assignment

affects timing because different industries have different peak periods, and training is normally selected during off-peak periods. Advancing from an associate to senior associate can also prompt training. I include these variables in the analysis to control for non-random assignment.

Variables

Data was collected using three surveys and organizational records. A summary of the variable definitions are presented in Table 21 of Appendix B. A detailed explanation of the survey items appear in Appendix A. The psychometric properties of the multi-item constructs are presented in Table 19 and Table 20 of Appendix B.

Dependent Variables

Leadership behaviors were judged by the project leaders (self-rating), their project staff (subordinate rating), and their managers (manager rating). They were measured using dimensions from Yukl, Gordon, and Taber's (2002) leadership behaviors taxonomy. The authors identified twelve leadership behaviors that are categorized into three meta-behaviors: task behaviors, relationship behaviors, and change behaviors. The task behaviors are *clarifying roles*, *monitoring operations*, and *short-term planning*. The relationship behaviors are *consulting*, *supporting*, *empowering*, *recognizing*, and *developing*. The effective teaching portion of the training mapped to clarifying roles and developing behaviors, the mentoring portion to developing behaviors, and giving effective feedback to recognizing behaviors. I also created a behavioral measure for *correcting* to capture another important aspect of the training on providing feedback. I did not capture the four change behaviors and dropped the consulting behavior because they were less applicable to project leaders in this context, as determined in the interviews. I created four items rated on a 5-point Likert scale (1 = Not at all; 5 = A great extent) for each of the eight behavioral dimensions. Respondents could also answer "Don't know".

To keep the manager survey short, I asked managers one question (instead of four) for each of the eight leadership behaviors. Each question was a combination of aspects from the four-item construct. Managers were asked to rate the leadership behaviors of a project leader *three months ago*, which corresponds to the beginning of the study period. They provided responses on the same 5-point scale as project leaders and subordinates. They were also asked to rate the *change* in the eight leadership behaviors over the prior three months on a 7-point scale (1 = declined greatly, 4 = about the same, 7 = improved greatly).

Because clarifying roles, developing, recognizing, and correcting applied directly to training, these behaviors were the dependent variables. The other leadership behaviors acted as within-person comparisons to test for the impact of training. For instance, short-term planning was unlikely to be impacted by training because it had no overlap with the training material. Differences in growth between short-term planning and developing among trained participants offered additional evidence of the training effect.

I reviewed the leadership behaviors with PPA to ensure that they were indicative of the behaviors required by project leaders. I also pretested the leadership behavior measures with a separate sample selected using Amazon Mechanical Turk (Mturk). I sampled 100 individuals with management experience and analyzed the psychometric properties of the items. Based on the results, I made adjustments to two scale items.

During the two training sessions, I recorded the amount of time spent on each behavior by mapping the lecture, practice or discussion time to the measure items that most closely matched. Approximately 70 minutes were spent on developing and clarifying behaviors in part one of the training, 60 minutes on recognizing and correcting behaviors in part two, and 80 minutes on developing in part three. There were some brief portions of the training that touched upon supporting, empowering, and short-term planning behaviors, but they were fleeting.

The confirmatory factor analysis for time-varying constructs (those measured at multiple points over time) are presented in Table 19. The CFA included the eight leadership behaviors and self-efficacy. The CFA was based on project leader responses; a very similar CFA was generated for subordinate responses, but is not shown. The fit statistics all indicated adequate fit (CFI = 0.94, NNFI = 0.93, RMSEA = 0.051). The coefficient alpha statistics were all above 0.85. The construct correlations in Table 19 indicate that the leadership behaviors correlated strongly with one another. I tested an alternative model in which leadership behaviors were forced to a single construct, but the fit of the model declined. I also tested a model in which developing and clarifying roles behaviors were merged (they had the highest correlation), but the model fit again declined. Overall, the CFA suggested the constructs possessed good convergent and discriminant validity.

Independent Variable

The independent variable is whether an individual was trained or not. The treatment exists for Trained Group 1 (June) in weeks 6 and 12, and Trained Group 2 (July) in week 12.

Moderators

There are five moderators: experience, cognitive ability, motivation to lead, learning goal orientation, and self-efficacy.

Experience was measured in two ways with four measures. First, it was measured as a duration: project leaders were asked how many tax and audit projects they had led and the number of months of experience they had leading tax and audit projects. They were also asked how many months of experience they had leading in other organizations prior to PPA. Because both duration measures were right skewed, I used the natural log (plus one) of the total projects led and the total months leading in the analysis. Second, experience was measured as an exposure: both the breadth and the depth of leadership experiences. To measure exposure, I created a 10-item index for situations that project leaders might have faced and asked them to check off the situations they had encountered. Project leaders were then asked the extent of experience with each checked-off item on a 5-point scale (1 = very little; 5 = very great). After pre-testing the measures with the Mturk sample, one item was dropped so that a 9-item index was used in the actual study (see Appendix A). Breadth was measured as the number of items checked off. Depth was measured as the average of the responses on the extent scale for the subset of items experienced. If an individual had not experienced any of the nine items (thus having no extent values to average), then their depth score was set to 1. Because the measures were indices and not latent constructs, they were not included in the CFA analysis. The coefficient alpha statistics for the breadth and depth measures were 0.72 and 0.78, respectively.

Cognitive ability was measured using the project leader's SAT or ACT score. The SAT and ACT are considered good measures of general mental ability (Coyle & Pillow, 2008; Koenig, Frey, & Detterman, 2008), and nearly all participants had taken one of the two tests within the last 10 years. Also, using SAT and ACT scores reduced the size of the survey instrument, which reduced the risk of respondent fatigue and dropout. SAT scores were converted to ACT scores using a conversion table.

Motivation to lead was measured using Chan and Drasgow's (2001) affective and calculative motivation to lead (MTL) construct. Motivation to lead is considered a fairly stable individual difference drawn from one's interests, abilities, and personal history. I adopted the affective and calculative dimensions of MTL. I used a subset of 13 items from the original scales, which capture the intrinsic and instrumental motivations of employees. After pretesting the measure using the Mturk study, I removed three items, leaving five items for the affective dimension (coefficient $\alpha = 0.73$) and five for the calculative dimension. One additional item was dropped from

the calculative dimension when constructing the CFA due to poor loading, which left a four item construct (coefficient $\alpha = 0.77$).

Learning goal orientation was captured using an 8-item measure from Button, Mathieu, and Zajac (1996). It was measured using a 7-point scale (1 = strongly disagree; 7 = strong agree). The measure captured a leader's orientation toward mastering new and challenging tasks (coefficient $\alpha = 0.90$).

Self-efficacy was measured using a new scale that was specific to the study context. I followed Bandura's (2006) guide for developing self-efficacy scales (coefficient $\alpha = 0.93$). It was a 10-item scale on which respondents rated how certain they were that they could do each leadership task (0 = cannot do at all; 10 = highly certain can do; see Appendix A). Self-efficacy was included in the time-varying CFA in Table 19. For the analysis, only the self-efficacy prior to training (at week 0) was used because the hypothesis is concerned with pre-training self-efficacy.

Control Variables

The primary control variables used in the analysis were *industry assignment*, *job level*, *hire quarter*, and *opportunity to lead*. The first three variables were used to account for systematic reasons that individuals might select into the trained or control group. Opportunity to lead accounted for heterogeneous improvement in leadership behaviors due to opportunity to gain new experience leading. It controls for differences in improvement in weeks 6 and 12. It was measured as a two-item summation of the percent of time leaders (1) directly instructed/taught staff and (2) performed other leadership activities.

Other covariates were collected as well. These included whether or not project leaders' were CPAs and their *tenure* in the company, collected from organizational data. Using the survey, I also captured project leaders' *conscientiousness* (coefficient $\alpha = 0.84$), *extraversion* (coefficient $\alpha = 0.83$), and *openness to experience* (coefficient $\alpha = 0.73$); the extent of *supervisory support* (coefficient $\alpha = 0.93$); and average *weekly hours worked* and in the prior five weeks. The Big 5 personality traits were measured using scales from the International Personality Item Pool (Goldberg, 2014). The supervisory six-item support scale came from Yarnall (1998). These additional covariates were not included in the primary analysis, but were included in supplemental analysis to observe their effect.

For subordinate responses, I included controls for subordinates' *agreeableness* (coefficient $\alpha = 0.79$) and *length of relationship* with the project leader. For manager responses, I included the managers' *observation extent* of the project leader (single item: 1 = None, 5 = Very great extent).

The CFA for time-invariant moderators and controls (constructs only measured once) is presented in Table 20 of Appendix B. The fit statistics indicate there is appropriate convergent and discriminant validity (CFI = 0.92, NNFI = 0.91, RMSEA = 0.045). The construct correlations in Table 20 indicate a strong positive relationship between affective motivation to lead and extraversion ($r = 0.48$), between affective motivation to lead and learning goal orientation ($r = 0.39$), and between learning goal orientation and openness to experience ($r = 0.40$).

Sample

Rater Perspectives

There were three related samples that I analyzed: the project leader self-report sample, the subordinate report sample, and the manager report sample. Each sample provided a different view of the leaders' development. Ideally, there would be strong agreement between perspectives such that the training effect would be clear and unambiguous. However, there is little reason this should be expected, and agreement among perspectives was elusive in these samples. First, it is difficult to argue there is one objective reality of a person's leadership ability. The value placed on leadership behaviors can differ based on multiple factors (House, Hanges, Javidan, Dorfman, & Gupta, 2004). That is not to say that leadership cannot be measured. The important point is that differences among perspectives may not only be due to measurement error or bias—it can also indicate important differences in how individuals value leadership behaviors from their viewpoint. Second, perspectives may differ based on how individuals interact with the leader. For instance, leaders who rate their own behaviors have access to all their thoughts, motives, attitudes, and intentions as well as behaviors. Small changes in behavior or attempts to improve would be recognized by the individual but likely missed by subordinates or managers. Subordinates, who in this context worked closely with the leaders, also have a unique perspective on how the actions of their leaders benefit them. Moreover, certain leadership behaviors that are valued by managers may not be valued by subordinates, and thus rated differently. Managers at PPA were not necessarily at project sites, so their first-hand observations of leader-subordinate interactions were somewhat limited. Managers often gathered information from second-hand sources to supplement when first-hand observations of leader behaviors were lacking. Managers were primarily concerned with client relationships, a perspective not necessarily shared by subordinates. Thus, their perspectives on leadership behaviors differ as well.

Table 1. Leader, subordinate, and manager samples.

	Control	Trained 1	Trained 2	Total
Full leader sample	121	125	29	275
Leader self-rating				
Leaders who responded	66 (55%)	81 (65%)	23 (79%)	170 (62%)
Breakdown by week 0 / 6 / 12	58 / 49 / 57	70 / 44 / 59	21 / 18 / 22	149 / 111 / 138
Two or more responses	53 (44%)	57 (46%)	21 (72%)	131 (48%)
All three responses	38 (31%)	31 (25%)	17 (59%)	86 (31%)
Individual attributes captured	66 (55%)	78 (62%)	23 (79%)	167 (61%)
Careless responders	3 (2%)	4 (3%)	2 (7%)	9 (3%)
<i>Reasons for no response</i>				
No leadership assignments	14 (12%)	19 (15%)	1 (3%)	34 (12%)
Left company	12 (10%)	10 (8%)	2 (7%)	24 (9%)
Subordinate rating of leader				
Leaders rated	64 (53%)	50 (40%)	13 (45%)	127 (46%)
Breakdown by week 0 / 6 / 12	44 / 36 / 47	28 / 26 / 33	9/8/2008	81 / 70 / 88
Ratings per rated leader per week	1.5	1.2	1.2	1.3
Leaders rated two or more weeks	42 (35%)	27 (22%)	10 (34%)	79 (29%)
With attributes captured	23 (19%)	16 (13%)	7 (24%)	46 (17%)
Leaders rated all three weeks	21 (17%)	10 (8%)	2 (7%)	33 (12%)
With attributes captured	15 (12%)	7 (6%)	2 (7%)	24 (9%)
<i>Judge characteristics</i>				
Full subordinate sample				352
Judges who responded				256 (73%)
Judges rating sample leaders				130 (37%)
Careless judges				13 (4%)
Non-sample leaders rated				336
Manager rating of leader				
Leaders rated	52 (43%)	76 (61%)	14 (48%)	142 (52%)
With captured attributes	35 (29%)	60 (48%)	12 (41%)	107 (40%)
<i>Judge characteristics</i>				
Full manager sample				195
Judges who responded				121 (62%)
Careless judges				3 (2%)

Percentages are based on the full leader sample, except for judge percentages, which are based on the full sample of subordinates or managers.

Sample Sizes

A summary of all three samples is presented in Table 1. There were 275 project leaders total in the control group and two trained groups. Of those, 131 responded to at least two surveys (48 percent) and 86 responded to all three surveys (31 percent). At least two survey responses were needed to

use the leadership self-ratings. Of the 131 project leaders, 53 were from the control group and 78 were from the trained groups.

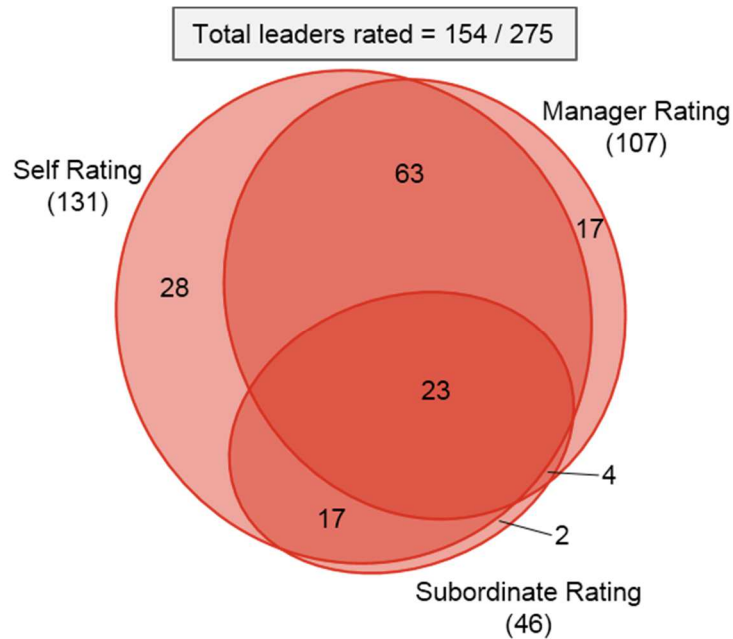
Among the subordinates, 73 percent rated leaders, but many of the responses were for project leaders who were not in the sample. PPA was unable to provide a project leader-subordinate matching prior to surveying subordinates. Thus, I surveyed all project staff in the company and asked them to rate one of the 275 leaders in the sample. However, many of the subordinates had not worked with any of the 275 leaders, so only 37 percent rated project leaders in the sample. Seventy-nine project leaders were rated at least twice by subordinates, but only 46 of those had matching attribute data. (Leader attribute data was acquired from the project leader survey, so the project leader must have responded at least once for the matched subordinate data to be used.) Of the 46 project leaders, 23 were from the control group and 23 were from the trained groups. Thus, the subordinate sample is much smaller than desired. Because the subordinate sample represents only 17 percent of the project leaders, some caution must be shown in interpreting the results derived from it.

Sixty-two percent of managers provided one or more ratings of project managers. Unlike the subordinate matching, PPA was able to provide data on the project leader-manager match, so all responses are for project leaders in the sample. Of the 142 project leaders rated by their managers, 107 of them (40 percent) had accompanying attribute data. Of the 107 project leaders, 35 were from the control group and 72 were from the trained groups.

The leader data were organized into a leader-week-behavior panel. If there were no missing data, then a leader would have up to twelve observations: four leader behaviors (clarifying roles, developing, recognizing, and correcting) for three different weeks (0, 6 and 12). However, the week 0 observations were used as a baseline measure, so they did not count as separate observations. The final leader sample included 831 observations for 131 project leaders. The sample that was used to compare trained leader behaviors to non-trained behaviors (using all eight behaviors and only the trained leaders) included 1554 observations for 78 trained leaders.

The subordinate data was organized into a leader-subordinate-week-leader behavior panel. Leaders had an average of 1.3 subordinates rate them. Like the leader panel, the subordinate panel included observations for week 0, week 6 and week 12 for the four leader behaviors included in the training. The subordinate panel included 432 observations provided by 73 subordinates for 46 leaders. The sample for the trained vs. non-trained behaviors included 564 observations provided by 38 subordinates for 23 leaders.

Figure 5. Number of project leaders rated, by perspective.



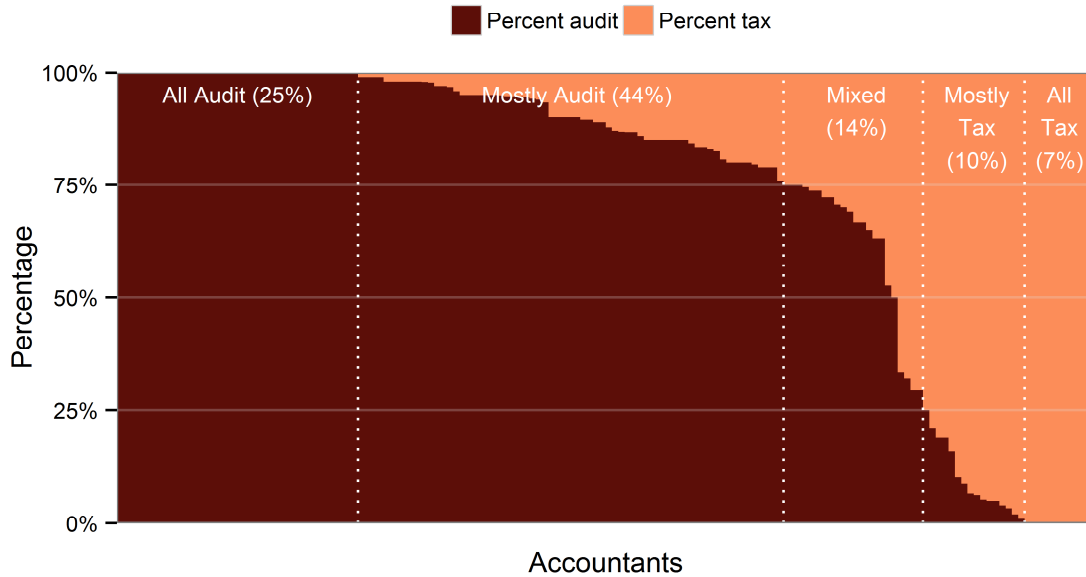
The manager data was organized into a leader-behavior panel. Leaders were only rated by one manager at one time (see Figure 4). The manager panel included 398 observations provided by 94 managers concerning 107 project leaders. The sample for the trained vs. non-trained behaviors included 541 observations for 72 leaders. Figure 5 presents the overlap between samples. The figure shows that nearly all leaders in the subordinate and manager samples are also included in the project leader sample.

Figure 6 presents the breakdown of leaders between tax and audit. It indicates that the majority of project leaders (69 percent) in our sample primarily led audit projects. Only 14 percent balanced audit and tax project leadership and 17 percent primarily lead tax projects.

Nonresponse Bias Tests

One concern is that project leaders not included in the final sample might have been different from those included in the sample in a way that biased the results. I tested for nonresponse bias by comparing the observable characteristics of leaders in the sample with those who were not. Some characteristics—including job level, CPA, and tenure—were available from company data, which allowed me to compare all leaders within and without the final sample. For other observable characteristics taken from the surveys, I compared leaders with two or more survey responses to

Figure 6. Project leader audit vs. tax.



leaders with only one survey response (which excludes them from the final sample). For each leader characteristic, I used a two-sample t-test to compare the mean for leaders with usable responses to the mean for leaders with no response or unusable responses. A significant t-test for a given characteristic indicates the two groups were different on that characteristic. As indicated in Table 2, only one of 35 characteristics was significantly different: supervisory support.

Further examination of supervisory support suggested the significant difference between those within and without the sample was not problematic. Regression analysis indicated that its relationship with the dependent variables does not differ across usable and unusable responses. That is, supervisory support had the same effect on leadership behaviors (for self-ratings and subordinate ratings) whether the leader was within or without the final sample. So while those within the sample experienced greater supervisory support than those without, the estimated effect remained consistent. Overall, there is no indication that missing responses biased the results.

Careless Responses

Another concern is that individuals might have carelessly responded to the survey questions. Careless responses can be identified post-hoc using a variety of methods, including Mahalanobis

Table 2. Nonresponse comparisons.

	No / unusable response	Usable response		No / unusable response	Usable response
Leader self-rating			Leader characteristics		
Clarifying roles	3.3	3.4	Percent audit vs. tax	60	74
Developing	3.0	3.1	Conscientiousness	4.0	4.2
Recognizing	3.2	3.3	Extraversion	3.4	3.3
Correcting	3.5	3.5	Openness to experience	3.3	3.5
Supporting	3.8	3.9	Supervisory support	4.4	5.5**
Empowering	3.1	3.4	Job level (1 = senior)	0.34	0.40
Monitoring operations	2.9	3.1	CPA (1 = yes)	0.43	0.55
Short-term planning	2.5	2.9	Tenure (years)	1.99	2.07
Subordinate rating of leader			Weekly hours worked	44	44
Clarifying roles	4.1	3.9	Opportunity to lead	57	59
Developing	4.0	3.9	Number of projects led	19	14
Recognizing	3.9	3.6	Total months leading	27	24
Correcting	4.1	3.7	Experience breadth	5.2	4.4
Supporting	4.2	3.7	Experience depth	3.1	2.9
Empowering	4.1	3.7	Cognitive ability	27	26
Monitoring operations	4.0	3.5	Affective motivation to lead	5.1	5.3
Short-term planning	3.9	3.7	Calculative motiv. to lead	2.5	2.4
			Learning goal orientation	6.2	6.0
			Self-efficacy	6.1	6.7

* $p < .05$, ** $p < .01$

distance, time taken to complete the survey, and long strings of the same response (Johnson, 2005; Meade & Craig, 2012). Mahalanobis distance identifies observations that are significant outliers in a multidimensional space. Survey responses were flagged as careless if the distance was significant at the .001 level, which is a common cutoff. Also, if individuals provided the same item value repeatedly (e.g. a long string of fives on a five-point scale), it was flagged as careless. Finally, those who took the survey very quickly were flagged as careless. As indicated in Table 1, between two and four percent of responses from leaders, subordinates, and managers were flagged. I still used these responses in the analysis because the post-hoc tests include some uncertainty as to whether they are capturing truly careless responses, but I included robustness tests that exclude them to make sure that they did not impact the results.

Appropriateness of Nonrandom Groups

When I constructed the control group, I attempted to include project leaders who most closely resembled those that were trained so that they would provide an appropriate counterfactual. (Randomization, of course, does this best.) If the suitability of the control group using nonrandom assignment approaches what can be achieved via random assignment, then simple OLS regression will provide consistent estimates. However, this is difficult to achieve in practice. To test how well the control group matched the trained groups, I compared the mean leadership behaviors at week 0 and leader characteristics across groups. If the groups were fully randomized, then no significant differences would be found beyond chance. Table 3 indicates that there were a number of significant differences. Leader and manager ratings of developing behaviors at week 0 were significantly lower than the control group, and manager ratings of clarifying roles, correcting, monitoring operations, and short-term planning were also significantly lower. Trained Group 1 had systematically lower ratings across perspectives. The trained groups also had less senior associates compared to the control group and they had less tenure in the company. They had also led fewer projects.

The differences in leadership behaviors were greatly reduced by the inclusion of selection controls (industry assignment, hire quarter, and job level) and opportunity to lead. In other words, conditional on the controls, the groups moved closer toward the ideal that would be achieved through random assignment. For leader self-reported behaviors, Trained Group 1 was 0.22 lower than the control group across all eight leadership behaviors at week 0, which was marginally lower ($p < .10$). Trained Group 2 was slightly higher ($d = 0.16$ higher; $p = n.s.$). However, after accounting for the controls, Trained Group 1 was only 0.01 lower than the control group ($p = n.s.$). For subordinate reports, Trained Group 1 was 0.27 lower than the control group at week 0, which was also marginally lower ($p < .10$). Trained Group 2 was about the same ($d = 0.06$ lower; $p = n.s.$). After accounting for the controls, Trained Group 1 was only 0.16 lower than the control group ($p = n.s.$). For manager reports, Trained Group 1 ($d = 0.45$ lower) and Trained Group 2 ($d = 0.61$ lower) had significantly lower base leadership behaviors than the control group ($p < .01$ for both). After including the controls, the differences between the control group and Trained Group 1 ($d = 0.26$ lower) and between the control group and Trained Group 2 ($d = 0.30$ lower), though still present, were no longer significant.

Additionally, Table 3 indicates that the number of projects led by Trained Group 1 was significantly lower than the control group. However, the difference was accounted for by the controls and by recognizing that the range of projects led by control group leaders was beyond that

Table 3. Nonrandom group comparisons.

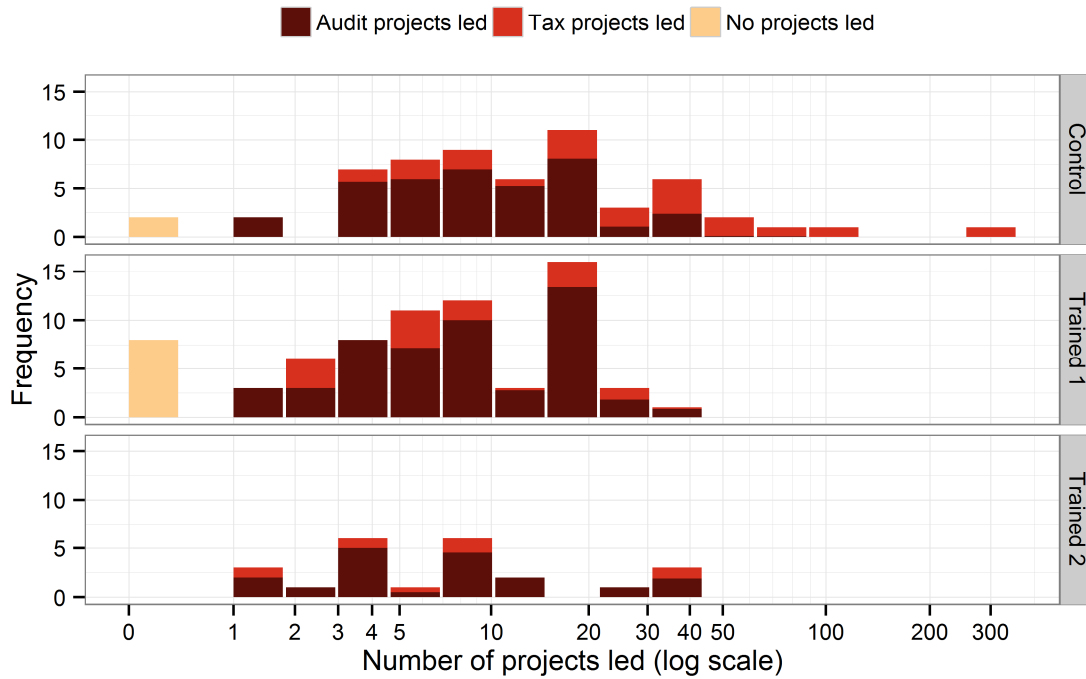
	Control	Trained 1	Trained 2		Control	Trained 1	Trained 2
Leader self-rating (week 0)				Leader characteristics			
Clarifying roles	3.5	3.2	3.6	Percent audit vs. tax	68	76	78
Developing	3.3	2.8*	3.5	Conscientiousness	4.2	4.1	4.1
Recognizing	3.4	3.2	3.4	Extraversion	3.3	3.3	3.6
Correcting	3.6	3.4	3.7	Openness to exper.	3.4	3.5	3.6
Supporting	3.9	3.9	4.2	Supervisory support	5.6	5.4	5.6
Empowering	3.4	3.1	3.5	Job level (1 = senior)	0.73	0.21***	0.13***
Monitoring operations	3.2	3.0	3.4	Tenure (years)	2.26	1.97**	1.87**
Short-term planning	2.8	2.6	3.0	CPA (1 = yes)	0.59	0.50	0.57
Subordinate rating of leader (week 0)				Weekly hours worked			
Clarifying roles	4.2	3.8	4.1	Opp. to lead, week 0	44	43	46
Developing	4.2	4.0	4.2	No. of projects led	49	43	64
Recognizing	3.9	3.6	4.0	Total months leading	22	9*	10
Correcting	4.2	3.8	4.0	Experience breadth	28	20	22
Supporting	4.1	4.0	4.5	Experience depth	4.6	4.1	4.8
Empowering	4.0	3.8	4.4	Cognitive ability	3.0	2.8	3.1
Monitoring operations	4.1	3.9	3.9	Affect. motiv. to lead	27	26	28
Short-term planning	4.0	3.9	4.1	Calc. motiv. to lead	5.2	5.3	5.6
Manager rating of leader (base)				Learning goal orient.			
Clarifying roles	3.1	2.7	2.3*	Self-efficacy, week 0	6.0	6.0	6.4
Developing	2.8	2.2*	2.0*		6.8	6.2	6.7
Recognizing	2.7	2.5	2.3				
Correcting	3.3	2.6**	2.5*				
Supporting	3.5	3.3	3.2				
Empowering	2.9	2.6	2.3				
Monitoring operations	3.3	2.7*	2.7				
Short-term planning	3.2	2.5*	2.5				

Means of trained groups 1 & 2 are compared to mean of control group.

* $p < .05$, ** $p < .01$, *** $p < .001$

of the trained group leaders. As the histogram in Figure 7 shows, the larger number of projects led by the control group was driven by a few leaders who had led substantially more projects (particularly tax projects). The trained group leaders had led at most 40 projects while two leaders in the control group had led over 100 projects. These few control group leaders may not be good candidates to compare to the trained group on this dimension because the trained groups had no analog to them. After removing control group leaders who led more than 40 projects and accounting for the controls, the 13-project average difference between Trained Group 1 and the control group was reduced to two projects ($p = n.s.$). The difference between Trained Group 2 and the control group also fell to two projects. In the main analysis, the leaders in the control group who had lead

Figure 7. Number of projects led.



more than 40 projects were still included because they were similar to the trained groups on other attributes, but I provide supplementary analysis to examine the results when they are excluded. (It made little difference whether these control group members were included or excluded.)

Analytic Approach

By using a replicated pre- and post-test design and control group as well as additional controls to account for selection and post-treatment heterogeneity, many of the threats to internal validity were dealt with. However, there could still be unobserved attributes or conditions that could bias the estimates. There were three different ways by which I dealt with these additional threats. I used a lagged dependent variable specification and first-differencing specification to control for time-specific and time-invariant unobserved factors, respectively. I also used the non-trained behaviors as the counterfactual instead of the control group as an alternative test.

Training Effect: Trained vs. Control Groups

First differencing (and fixed effect) specifications are able to account for time-invariant factors that may bias regression estimates. However, confounding factors may not be time invariant and can be better accounted for by using a lagged dependent variable (Angrist & Pischke, 2009). Whether any potential bias can be corrected better by a first differencing or lagged dependent variable was uncertain in my context, so following the suggestion of Angrist & Pischke (2009), I present results for both specifications. The following regression specification using a lagged dependent variable was used to estimate the main effect of training for leader self-reported data:

$$(1) \quad y_{iwk} = \beta_0 + y_{iw_0k}\beta_1 + w\beta_2 + T_{1i}\beta_3 + T_{2i}\beta_4 + wT_{1i}\beta_5 + wT_{2i}\beta_6 + b_{iw} + \gamma_k + [\text{controls}] + \epsilon_{iwk}.$$

In (1), y_{iwk} was the self-rating of leadership behavior k by leader i in week w , and y_{iw_0k} was the self-rating for leadership behavior k by leader i at week 0. The variable w took the value of 0 for week 6 and the value of 1 for week 12. The variable T_{1i} was the Training 1 treatment for leader i (1 = trained in Group 1, 0 = otherwise), and T_{2i} was the Training 2 treatment of leader i (1 = trained in Group 2, 0 = otherwise). The parameter b_{iw} was a random leader-week effect that accounted for the expected correlation among leadership behaviors for the same leader i within a given week w , and γ_k was a fixed effect for each leadership behavior. The primary coefficients of interest for Hypothesis 1 were β_3 and β_6 , which estimated the impact of the first and second training, respectively, on leadership behaviors five weeks after treatment. If the training had the same impact on both groups ($\beta_3 = \beta_6$), if the impact of Training 1 leveled off after week 6 ($\beta_5 = 0$), and if Trained Group 2 before training was the same as the control group ($\beta_4 = 0$), then the model simplified to

$$(2) \quad y_{iwk} = \beta_0 + y_{iw_0k}\beta_1 + w\beta_2 + T_{iw}\beta_3 + b_{iw} + \gamma_k + [\text{controls}] + \epsilon_{iwk},$$

where $T_{iw} = T_{1i} + wT_{2i}$ was the training status of leader i at week w and β_3 captured the average effect for Trained Group 1 five and eleven weeks after training and Trained Group 2 five weeks after training. The analogous first difference equation was specified as

$$(3) \quad (y_{iwk} - y_{iw_0k}) = \beta_0 + w\beta_2 + T_{iw}\beta_3 + b_{iw} + \gamma_k + [\text{controls}] + \epsilon_{iwk}.$$

The controls for (3) omitted job level, industry, or hire quarter because these time-invariant controls dropped out of the model when taking the difference. Also, note that week 12 is subtracted from week 0 instead of week 6 for the DV so the estimation of β_3 was comparable with the lagged model.

The moderating effect of experience or the other hypothesized individual characteristics m_i were specified in the lagged model as

$$(4) \quad y_{iwk} = \beta_0 + y_{i_{w_0}k}\beta_1 + w\beta_2 + T_{iw}\beta_3 + m_i\beta_4 + T_{iw}m_i\beta_5 + b_{iw} + \gamma_k + [\text{controls}] + \epsilon_{iwk},$$

where β_4 was the main effect of the individual characteristic and β_5 was the moderating effect. In hypotheses H2 through H6, β_5 was the parameter of interest.

For the subordinate sample, the analogous specification to (2) was

$$(5) \quad y_{ijwk} = \beta_0 + y_{i\bar{j}w_0k}\beta_1 + w\beta_2 + T_{iw}\beta_3 + a_j\beta_4 + r_{ij}\beta_5 + b_{iw} + b_{jw} + \gamma_k + [\text{controls}] + \epsilon_{ijwk}.$$

The difference between (5) and (2) was that y_{ijwk} was the rating of leadership behavior k by subordinate j for leader i at week w and $y_{i\bar{j}w_0k}$ was the average rating of leadership behavior k by all subordinates \bar{j} who rated leader i at week 0. The average across subordinates was used at week 0 so that ratings of leader i by subordinate j in week 6 or 12 could be used even if j did not rate i at week 0 (but other subordinates did). The variables a_j and r_j were for the agreeableness of subordinate j and the relationship length of j with leader i . The parameter b_{jw} was a random subordinate-week effect that accounted for the expected correlation among leadership behaviors for the same subordinate j within a given week w .

For the manager sample, the analogous specification to (2) was

$$(6) \quad y_{ik} = \beta_0 + y_{i_{w_r}k}\beta_1 + T_i\beta_2 + o_i\beta_3 + b_{iw} + \gamma_k + [\text{controls}] + \epsilon_{ik},$$

where y_{ik} was the rating of the *change* in leadership behavior k for leader i and $y_{i_{w_r}k}$ was the retrospective baseline value of leadership behavior k . The variable $T_i = T_{1i} + T_{2i}$ was the indicator for the trained groups and β_2 was the parameter of interest. The variable o_i was the extent to which the manager has observed project leader i . There was no analogous first difference specification because there were no measurements at multiple points in time. Nor did (6) truly employ a lagged dependent variable because the baseline response ($y_{i_{w_r}k}$) was retrospective.

Training Effect: Trained vs. Non-Trained Behaviors

An alternative method to estimate the effect of training was to compare leadership behaviors that were trained (i.e. clarifying roles, developing, recognizing, correcting) to behaviors that were not part of the training (i.e., empowering, supporting, monitoring operations, short-term planning). This was a conservative test because there were likely spillover effects from the trained behaviors to the non-trained behaviors and the training did touch upon non-trained behaviors in some brief, tangential ways. The benefit of this test was that it performed a within-person comparison, which naturally created an appropriate control group. Because of this, there was not the same concern about omitted variables as was the case when using the non-trained control group of leaders as the counterfactual. Since the non-trained behaviors were used as the counterfactual, the leaders who were not trained were omitted from the analysis. The training effect was estimated as the difference between trained and non-trained behaviors after training *after accounting for* the difference between trained and non-trained behaviors before training (i.e., a difference-in-difference approach). The specification for the self-report sample was

$$(7) \quad y_{iwk} = \beta_0 + d_k\beta_1 + g_i\beta_2 + T_{iwk}\beta_3 + \lambda_w + b_{iw} + [\text{controls}] + \epsilon_{iwk},$$

where d_k was 1 if the leadership behavior was part of training and 0 otherwise, g_i was 1 for Trained Group 2 and 0 for Trained Group 1, and T_{ikw} was 1 if leader i was trained in week w for behavior k . The parameter λ_w was the estimated effect of each week, β_1 was the initial difference between the training and control behaviors and β_2 was the difference between the two trained groups. The parameter of interest was β_3 , which captured the training effect. To estimate the effect of the moderators, (7) was modified to include m_i and its interaction with T_{ikw} , similar to (4). The analogous specification to (7) for the subordinate sample was

$$(8) \quad y_{ijwk} = \beta_0 + d_k\beta_1 + g_i\beta_2 + T_{iwk}\beta_3 + a_j\beta_4 + r_{ij}\beta_5 + \lambda_w + b_{iw} + b_{jw} + [\text{controls}] + \epsilon_{ijwk}.$$

The analogous specification to (7) for the manager sample was

$$(9) \quad y_{ik} = \beta_0 + y_{iw_rk}\beta_1 + d_k\beta_2 + T_{ik}\beta_3 + o_i\beta_3 + b_{iw} + [\text{controls}] + \epsilon_{ik}.$$

For models (7) to (9), the only control used was opportunity to lead. The selection controls were omitted because selection problems were resolved naturally by the within-person comparison.

In the results that follow, the hypotheses corresponding with the leader self-rated sample were tested using the lagged dependent variable specification in (2) and the first difference specification in (3) for the control *group* comparison as well as the difference-in-difference specification for the control *behavior* comparison in (7). The hypotheses corresponding with subordinate sample were tested with the analogous specifications modified for the subordinate sample, as in (5). The hypotheses corresponding with the manager sample were tested using the retrospective base leadership behaviors for both the control *group* and control *behavior* comparisons, as specified in (6) and (9).

4. RESULTS

Descriptive Statistics

The means, standard deviations, minima, and maxima for selected variables are presented in Table 4. The full list of descriptive statistics is presented in Table 21 of Appendix B. When comparing across raters, Table 4 shows that subordinates rated project leaders the highest (between 3.9 and 4.1 on average for all behaviors), leaders rated themselves lower (between 3.1 and 3.5), and managers rated the project leaders the lowest (between 2.4 and 2.8 for *base* values). At the beginning of the study period, leaders averaged 2.3 log projects (9 projects on original scale) and 2.7 log months leading (14 months on original scale), which included leadership prior to PPA. Their average exposure to the nine leadership situations was 4.4 situations, and for those situations they had exposure to, their average depth of exposure was moderate (2.9 out of 5). Project leaders had an average ACT of 26 and had much stronger affective motivation (5.3 out of 7) than calculative motivation (2.3 out of 7) to lead. They also had a strong learning goal orientation on average (6.0 out of 7), and moderate confidence (self-efficacy) in their leadership abilities (6.5 out of 10).

Selected bivariate correlations for the leadership behaviors are presented in Table 5. The full matrix of bivariate correlations are presented in Table 22 of Appendix B. Table 5 shows that the correlations across behaviors and within each perspective were quite high, ranging from .44 to .79. These high correlations are not surprising since leaders are expected to concurrently develop different dimensions of their leadership ability. (The model specifications account for correlations across behaviors with the random effect parameters.) However, the correlations are low across perspectives for each corresponding leader behavior (i.e., between self-ratings and subordinate ratings, self-ratings and manager (base) ratings, and subordinate ratings and manager base ratings). The correlations between the ratings of leaders and subordinates range from -0.10 to 0.11 across the eight leadership dimensions ($\bar{r} = 0.04$). The average correlations between managers (their base ratings) and leaders and managers and subordinates were 0.13. These low correlations suggest that the perspectives on leader behaviors vary quite markedly.

Table 6 presents selected correlations among leader characteristics. The correlation between the (log) number of projects led and (log) total months leading was 0.55, suggesting the

Table 4. Selected descriptive statistics.

Variable	Mean	S.D.	Min	Max	Variable	Mean	S.D.	Min	Max
Leader self-rating					Leader characteristics				
Clarifying roles	3.4	0.9	1.0	5.0	Job level (1 = senior)	0.41	0.49	0.00	1.00
Developing	3.1	0.9	1.0	5.0	Opportunity to lead	58	32	0	100
Recognizing	3.3	0.9	1.0	5.0	Log no. of projects led	2.3	1.0	0.0	5.7
Correcting	3.5	0.8	1.0	5.0	Log total months leading	2.7	1.1	0.0	5.5
Subordinate rating of leader					Subordinate characteristics				
Clarifying roles	4.1	0.7	2.5	5.0	Experience breadth	4.4	2.3	0.0	9.0
Developing	4.1	0.7	1.8	5.0	Experience depth	2.9	0.7	1.0	4.4
Recognizing	3.9	0.9	1.0	5.0	Cognitive ability	26	4	16	34
Correcting	4.1	0.7	1.8	5.0	Affective motiv. to lead	5.3	0.9	2.8	7.0
Manager rating of leader					Manager characteristics				
Clarifying roles (change)	5.0	0.9	2.0	7.0	Calculative motiv. to lead	2.3	1.0	1.0	6.5
Developing (change)	5.1	0.9	4.0	7.0	Learning goal orientation	6.0	0.7	3.4	7.0
Recognizing (change)	4.5	0.8	4.0	7.0	Self-efficacy at week 0	6.5	1.5	1.3	9.6
Correcting (change)	4.7	0.9	2.0	7.0	Subordinate characteristics				
Clarifying roles (base)	2.8	0.9	1.0	5.0	Agreeableness	4.2	0.5	2.0	5.0
Developing (base)	2.4	0.9	1.0	5.0	Relationship months	7	5	0	24
Recognizing (base)	2.6	0.8	1.0	4.0	Manager characteristics				
Correcting (base)	2.8	0.9	1.0	5.0	Observation extent	3.5	0.9	2.0	5.0

two provide much common information about experience, but they are distinctive. The correlation between experience breadth and experience depth is only 0.27, which suggests the two measures are quite distinct. Experience depth is also distinct from number of projects led ($r = .12$) and total months leading ($r = .24$). Interestingly, experience breadth is more closely tied to total months leading ($r = 0.54$) than number of projects led ($r = 0.34$), and affective motivation to lead is related to total months leading ($r = 0.25$) but not number of projects led ($r = 0.01$). Self-efficacy is modestly correlated with all four measures of experience ($\bar{r} = 0.23$).

The hypothesis tests that follow present the relationship between the moderators (experience, cognitive ability, motivation to lead, learning goal orientation, and self-efficacy) and the change in leadership behaviors. It is also helpful, though, to also understand the direct relationship between the moderators as the base leadership behaviors (at week 0).

Table 7 presents the estimated effect of each moderator on the four focal leadership behaviors at the beginning of the study period. To estimate the effects, the leadership behaviors at week 0 (or the base behaviors for the manager responses) were regressed on the controls (industry, hire quarter, job level, opportunity to lead) and each moderator. (Separate regressions were

Table 5. Selected bivariate correlations: leadership behaviors.

Leader self-rating	(1)	(2)	(3)
(1) Clarify. roles			
(2) Developing	0.79		
(3) Recognizing	0.51	0.58	
(4) Correcting	0.56	0.56	0.63
Subordinate rating	(9)	(10)	(11)
(9) Clarify. roles			
(10) Developing	0.65		
(11) Recognizing	0.52	0.68	
(12) Correcting	0.64	0.74	0.76
Manager rating (chg.)	(17)	(18)	(19)
(17) Clarify. roles (chg.)			
(18) Developing (chg.)	0.44		
(19) Recognizing (chg.)	0.46	0.53	
(20) Correcting (chg.)	0.49	0.55	0.58
Cross Perspective	(1)...(4) [‡]	(9)...(12) [‡]	
Subordinate rating			
(9) Clarify. roles	-0.10		
(10) Developing	0.08		
(11) Recognizing	0.11		
(12) Correcting	0.05		
Manager rating (base)			
(25) Clarify. roles (base)	0.12	0.06	
(26) Developing (base)	0.19	0.11	
(27) Recognizing (base)	0.15	0.10	
(28) Correcting (base)	0.16	0.06	

[‡] Bivariate correlation with corresponding leadership behavior rated by leader (1 to 4) or subordinate (9 to 12).

estimated for each moderator.) The estimates suggests strong positive relationships between the project leaders' self-ratings and the four experience measures, cognitive ability, affective motivation to lead, learning goal orientation, and self-efficacy. However, subordinates rated leaders *lower* at week 0 who had led more projects, but the relationship is not significant. Managers also rated leaders *lower* who had greater depth of experience, though it is also not significant. Like the leaders themselves, managers and subordinates rated leaders higher when they had higher self-efficacy, but the higher rating was not significant. Together these descriptive regression coefficients indicate some disagreement between perspectives, but it is important to also recognize that the size of leader samples are quite different across perspectives.

Table 6. Selected bivariate correlations: leader characteristics.

	(38)	(42)	(43)	(44)	(45)	(46)	(47)	(48)	(49)	(50)
(38) Job level										
(42) Oppor. to lead	0.08									
(43) Log no. proj. led	0.40	0.16								
(44) Log tot. mos. lead.	0.29	0.13	0.55							
(45) Exper. breadth	0.22	0.20	0.34	0.54						
(46) Exper. depth	0.02	0.18	0.12	0.24	0.27					
(47) Cognitive ability	-0.09	0.13	0.09	-0.06	0.02	-0.02				
(48) Affect. motiv. to lead	-0.14	0.19	0.01	0.25	0.18	0.23	0.01			
(49) Calc. motiv. to lead	-0.19	0.02	-0.15	-0.30	-0.12	-0.05	0.04	-0.17		
(50) Learning goal orient.	-0.02	0.17	-0.04	0.15	0.14	0.04	0.03	0.31	-0.19	
(51) Self-efficacy	0.10	0.11	0.16	0.26	0.26	0.22	-0.03	0.21	-0.17	0.19

Table 7. Relationship between moderators and base (week 0) leadership behaviors.

	Self	Subordinate	Manager
Log no. of projects led	0.316***	-0.194	0.113
Log total months leading	0.137*	-0.077	0.030
Experience breadth	0.090**	-0.042	0.006
Experience depth	0.364***	0.115	-0.188
Cognitive ability	0.043*	0.005	0.034
Affective motivation to lead	0.249***	0.091	-0.078
Calculative motivation to lead	-0.081	0.072	-0.017
Learning goal orientation	0.186*	-0.012	0.040
Self-efficacy at week 0	0.235***	0.079	0.076

Each variable was estimated in a separate regression.

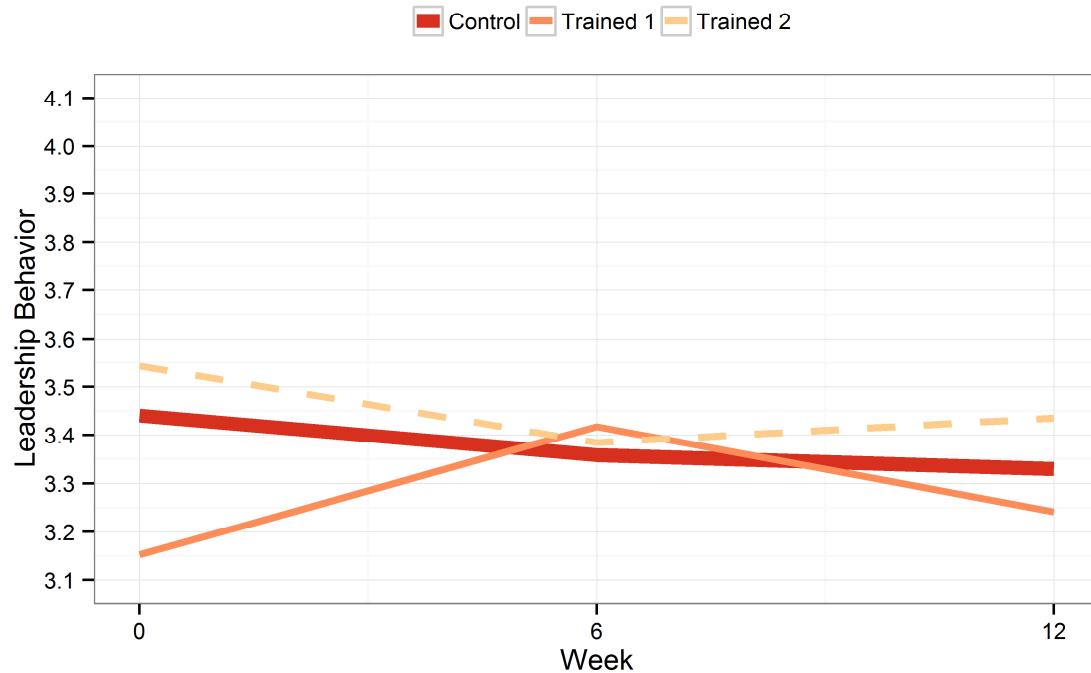
* $p < .05$, ** $p < .01$, *** $p < .001$; two-tailed tests

Leader Perspective

Main Effect of Training

Figure 8 illustrates the average leadership behaviors for each group over time. Only the four trained behaviors were used to create the figure. Trained Group 1 was trained in week 1, so the increase it displays between week 0 and week 6 is evidence of the training effect. During this same period the leadership behaviors of the control group and Trained Group 2 (which is like the control group during this period) decline. Trained Group 2 was trained in week 7, so the slight

Figure 8. Leadership behaviors over time: leader perspective.



increase from week 6 to week 12 is modest evidence of a training effect. During this same period the control group remains flat. Between week 6 and 12, Trained Group 1 retreats about half-way back toward its initial state, suggesting that some of the initial training benefits were lost over time.

Table 8 presents the regression estimates that test the significance of the trends in Figure 8. Only the training effect in the first-difference specification in Model A.2 is significant ($\beta = 0.224$, $p < .05$). The lagged specification in Model A.1 shows almost no change ($\beta = 0.019$, $p < n.s.$), and the control behavior specification in Model A.3 shows a small, nonsignificant decline compared to non-trained behaviors ($\beta = -0.058$, $p = n.s.$). The difference between Model A.1 and Model A.2 is driven by the different corrections in the models. Angrist and Pischke (2009) comment that the first-difference (i.e., fixed effect) and lagged specifications can act as upper and lower bounds for estimating the treatment effect. Thus, the average training effect is most likely between the two estimates. Model A.3, though negative, is similar to Model A.1. Taken together, the three models

Table 8. Main effect of training: leader perspective.

	Model A.1		Model A.2		Model A.3	
	Control Group, Lag		Control Group, F.D.		Control Behavior	
	Est.	S.E.	Est.	S.E.	Est.	S.E.
(Intercept)	1.027***	(0.279)	-0.473***	(0.129)	2.819***	(0.101)
Leadership at week 0	0.375***	(0.033)				
Leadership behavior dummies	Included		Included			
Leadership behavior (1 = training)					-0.005	(0.049)
Trained Group 2					0.096	(0.094)
Industry dummies	Included					
Hire quarter dummies	Included					
Senior associate	0.002	(0.100)				
Week 6					0.021	(0.110)
Week 12	-0.019	(0.081)	-0.019	(0.095)	-0.015	(0.110)
Opportunity to lead	0.010***	(0.001)	0.005**	(0.002)	0.008***	(0.001)
Trained	0.019	(0.092)	0.224*	(0.094)	-0.058	(0.067)
Log likelihood	-787.3		-945.9		-1764.2	
AIC	1626.2		1912.1		3550.5	
Observations	831		831		1554	
Leaders	131		131		78	

+ $p < .10$, * $p < .05$, ** $p < .01$, *** $p < .001$; two tailed tests.

provide evidence that the average training effect was nil to small in practical terms. They provide limited evidence to support Hypothesis 1a.

As part of the test of Hypothesis 1a, I also checked whether the training effect was sufficiently different by group (i.e., Trained Group 1 vs. Trained Group 2) or by week (i.e., 5 weeks after training vs. 11 weeks after training) to merit separating the effect thusly. I used a likelihood ratio test to compare a lagged specification that separated the training effect by week and group against Model A.1. The test was not significant ($\chi^2 = 1.39$, d.f. = 3, $p = n.s.$), suggesting that Model A.1—the more parsimonious model that estimates the average across group and week—is sufficient to capture the training effect.

Although there was little support for Hypothesis 1a, the training may have still benefitted some project leaders. If some project leaders benefitted but others did not, any effect may be obscured by the average treatment effect, which brings us to the moderating hypotheses, H2 through H6.

Table 9. Moderating effects entered individually: leader perspective.

	Model A.4(X)		Model A.5(X)		Model A.6(X)	
	Control Group, Lag		Control Group, F.D.		Control Behavior	
	Est.	S.E.	Est.	S.E.	Est.	S.E.
Trained (1)	-0.898***	(0.210)	-0.313	(0.225)	-0.343**	(0.126)
Log no. of projects led	-0.272***	(0.063)	-0.313***	(0.060)	0.098*	(0.049)
Trained * Log no. of projects led	0.404***	(0.085)	0.194*	(0.090)	0.136**	(0.051)
Trained (2)	-0.470+	(0.240)	0.038	(0.258)	-0.122	(0.124)
Log total months leading	-0.079	(0.061)	-0.121+	(0.065)	0.114**	(0.040)
Trained * Log total months leading	0.178*	(0.080)	0.051	(0.088)	0.026	(0.041)
Trained (3)	0.008	(0.386)	0.127	(0.432)	-0.094	(0.217)
Experience breadth	-0.022	(0.026)	-0.055+	(0.029)	0.038*	(0.017)
Experience depth	0.072	(0.092)	-0.181+	(0.101)	0.249***	(0.062)
Trained * Experience breadth	0.093**	(0.035)	0.063	(0.040)	0.042*	(0.019)
Trained * Experience depth	-0.145	(0.126)	-0.082	(0.140)	-0.049	(0.069)
Trained (4)	0.193	(0.615)	0.494	(0.706)	-0.221	(0.369)
Cognitive ability	0.004	(0.016)	0.005	(0.018)	0.006	(0.014)
Trained * Cognitive ability	-0.007	(0.023)	-0.010	(0.026)	0.006	(0.014)
Trained (5)	0.337	(0.608)	0.327	(0.700)	-0.915**	(0.350)
Affective motivation to lead	0.046	(0.074)	-0.059	(0.082)	0.034	(0.054)
Calculative motivation to lead	-0.069	(0.058)	-0.049	(0.062)	-0.144**	(0.045)
Trained * Affective motivation to lead	-0.044	(0.101)	-0.047	(0.115)	0.134*	(0.055)
Trained * Calculative motiv. to lead	-0.034	(0.082)	0.061	(0.090)	0.056	(0.046)
Trained (6)	-0.745	(0.684)	0.089	(0.767)	-0.946*	(0.388)
Learning goal orientation	0.060	(0.077)	-0.012	(0.084)	0.126*	(0.062)
Trained * Learning goal orientation	0.128	(0.112)	0.022	(0.127)	0.149*	(0.064)
Trained (7)	0.345	(0.370)	0.659	(0.407)	-0.135	(0.195)
Self-efficacy at week 0	0.086*	(0.042)	-0.037	(0.044)	0.144***	(0.027)
Trained * Self-efficacy at week 0	-0.044	(0.055)	-0.071	(0.060)	0.013	(0.029)

Models include the same controls as Model A.1, A.2, and A.3.

+ $p < .10$, * $p < .05$, ** $p < .01$, *** $p < .001$; two tailed tests.

Moderating Effect of Experience

Four variables are used to test the moderating impact of experience: log number of projects led, log total months leading, experience breadth, and experience depth (see the variable descriptions on page 22). Table 9 presents the moderating effect when the variables enter the model individually. Table 10 presents their moderating effect with all variables entered concurrently. The models in these tables include all of the controls found in Table 8, but they are not shown. There was strong support for Hypothesis 2a—which posited a positive moderating effect of experience—for two out of four experience measures. Leaders who had led more projects or who had greater breadth of

Table 10. All moderating effects: leader perspective.

	Model A.7		Model A.8		Model A.9	
	Control Group, Lag		Control Group, F.D.		Control Behavior	
	Est.	S.E.	Est.	S.E.	Est.	S.E.
Same controls as...	Model A.1		Model A.2		Model A.3	
Trained	-0.715	(1.132)	-1.108	(1.223)	-1.557*	(0.625)
Effect on control group / behavior						
Log no. of projects led	-0.229**	(0.082)	-0.343***	(0.076)	0.101	(0.062)
Log total months leading	-0.048	(0.093)	0.089	(0.095)	-0.074	(0.060)
Experience breadth	-0.032	(0.030)	-0.063+	(0.033)	0.019	(0.021)
Experience depth	0.007	(0.099)	-0.256*	(0.108)	0.193**	(0.064)
Cognitive ability	0.001	(0.017)	0.014	(0.018)	0.012	(0.012)
Affective motivation to lead	-0.010	(0.078)	-0.126	(0.088)	0.063	(0.057)
Calculative motivation to lead	-0.063	(0.063)	-0.082	(0.064)	-0.075	(0.046)
Learning goal orientation	0.074	(0.077)	-0.073	(0.083)	-0.008	(0.064)
Self-efficacy at week 0	0.086+	(0.046)	0.015	(0.048)	0.109***	(0.027)
Moderating effect: Difference between trained and control						
Trained * Log no. of projects led	0.427***	(0.116)	0.271*	(0.123)	0.245***	(0.071)
Trained * Log total months leading	-0.054	(0.124)	-0.073	(0.129)	-0.164*	(0.064)
Trained * Experience breadth	0.091*	(0.041)	0.064	(0.045)	0.049*	(0.023)
Trained * Experience depth	-0.087	(0.135)	0.076	(0.146)	-0.091	(0.076)
Trained * Cognitive ability	-0.019	(0.023)	-0.034	(0.026)	-0.010	(0.014)
Trained * Affective motivation to lead	-0.023	(0.110)	0.021	(0.123)	0.113+	(0.064)
Trained * Calculative motiv. to lead	0.061	(0.088)	0.084	(0.093)	0.118*	(0.052)
Trained * Learning goal orientation	0.126	(0.118)	0.257*	(0.130)	0.147*	(0.075)
Trained * Self-efficacy at week 0	-0.079	(0.059)	-0.104	(0.064)	-0.009	(0.032)
Log likelihood	-709.6		-853.4		-1610.4	
AIC	1510.3		1765.0		3280.0	
Observations	781		781		1454	
Leaders	122		122		73	

+ $p < .10$, * $p < .05$, ** $p < .01$, *** $p < .001$; two tailed tests.

experience benefitted more from training, but leaders who had more months of experience leading or greater leadership depth did not.

In Table 9 the strongest support was found for the number of projects led: Models A.4(1) (lagged DV), A.5(1) (first difference), and A.6(1) (control behavior) were all significant ($\beta = 0.404$, $p < .001$; $\beta = 0.194$, $p < .05$; $\beta = 0.136$, $p < .01$). Since all three models agreed and were significant, they provide clear evidence that the training was beneficial for those who had led more projects. When the other moderating variables were also included in the model (as shown in Table 10), the moderating effect of projects led remained strong ($\beta = 0.427$, $p < .001$; $\beta = 0.271$, $p < .05$;

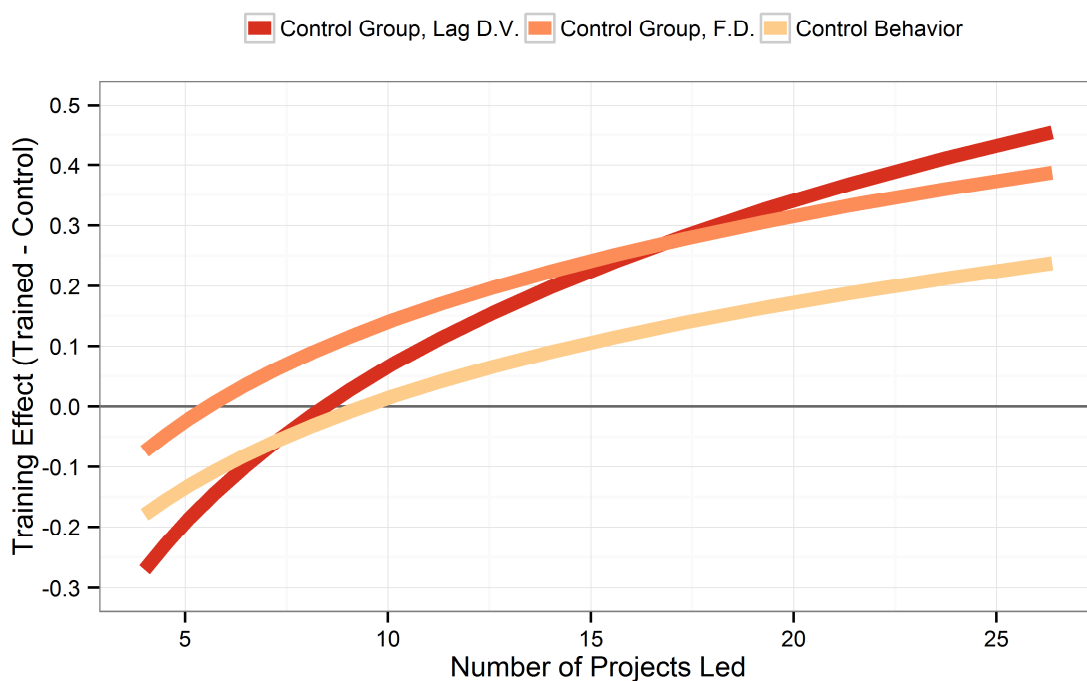
$\beta = 0.245, p < .001$). Figure 9 illustrates the predicted effect of training at different levels of experience based on projects led. The three lines represent the three models used to estimate the effect. The predictions were based on the models in Table 10. The results were transformed to the original scale. As depicted, training had no benefit for individuals who had led less than five to ten projects. The benefit of training became practically important (generally a 0.2 increase or more) after leading about 15 to 20 projects. Below five projects, trained leaders actually improved *less* than non-trained leaders with similar leadership experience.

The support found for number of projects led was not found for number of months leading. In Table 9, there was a significant positive moderating effect for Model A.4(2) ($\beta = 0.178, p < .05$); however, in Model A.7 in Table 10, the effect turned negative when the number of projects led was also included ($\beta = -0.054, p = n.s.$). For Models A.5(2) (first difference) and A.6(2) (control behavior), number of months leading was positive but not significant. In Models A.8, when the number of projects led was also included, the effect turned negative as well ($\beta = -0.073, p = n.s.$); In Model A.9, the effect turned negative and was significant ($\beta = -0.164, p < .05$). Together, the models provide evidence that number of months leading was beneficial only to the extent that it was correlated with number of projects led. Recall that the correlation between the two experience measures was 0.55. After accounting for the number of projects led, the results provide some evidence that number of months leading actually lessens the benefit of leadership training.

There was strong support for Hypothesis 2a based on *breadth* of experience, but not for *depth* of experience. Breadth and depth were entered together in Table 9 as they are closely related concepts that are best understood as a pair and they demonstrated a low bivariate correlation ($r = 0.27$). Models A.4(3) and Models A.6(3) in Table 9 show that training had significantly greater benefit for leaders with greater breadth of experience ($\beta = 0.093, p < .01$; $\beta = 0.042, p < .05$), and the effect remained significant in Models A.7 and A.9 when other moderators were also included in the model ($\beta = 0.091, p < .05$; $\beta = 0.049, p < .05$). In Model A.5(3), the moderating effect of experience breadth was positive but not significant ($\beta = 0.063, p = n.s.$). Note, though, that the coefficient in Model A.5(3) ($\beta = 0.063$) was larger than the same coefficient in Model A.6(3) ($\beta = 0.049$). The former was not significant because it had a larger standard error than the latter. Thus, although the estimate in Model A.5(3) is not significant, it is within the range of the same coefficient in the other two models.

While experience breadth improved the benefit of leadership training, experience depth did not; on the contrary, it may have lowered the benefit of training, though no estimates were significant. The estimated moderating effect of experience depth in Models A.4(3) to A.6(3) were

Figure 9. Predicted effect of training and experience (projects led).



negative ($\beta = -0.145$, $p = n.s.$; $\beta = -0.082$, $p = n.s.$; $\beta = -0.049$, $p = n.s.$) and remained negative in two out of three models in Table 10 when other moderators were added.

Additional analysis revealed that experience breadth was also moderated by the combination of experience breadth and opportunity to lead. While not explicitly hypothesized, the three-way interaction fits within the existing framework for the hypotheses. One underlying premise in the hypotheses is that leaders will have the opportunity to apply what they learn so that the training is remembered and behaviors are solidified (Ford, Quiñones, Segó, & Sorra, 1992; D. H. Lim & Johnson, 2002). Thus, the combination of the opportunity to lead after training and experience prior to training could potentially be required for training to be beneficial. Table 11 extends the models in Table 10 to include a three-way interaction with training, experience, and opportunity to lead. The three-way interaction was positive and significant in Model A.10 ($\beta = 0.003$, $p < .01$) and Model A.11 ($\beta = 0.002$, $p < .10$), but not A.12 ($\beta = 0.000$, $p = n.s.$). The positive effect provides evidence that leaders need both a breadth of experience and the opportunity to lead after training to benefit from it. Notice also that the two-way interaction between opportunity to lead and training was negative and significant in Models A.10 and A.11 in Table 11 ($\beta = -0.014$, $p < .05$; $\beta = -0.013$, $p < .10$), which suggests that the three-way interaction is driven partly by the

Table 11. Three-way interaction with opportunity to lead: leader perspective.

	Model A.10		Model A.11		Model A.12	
	Control Group, Lag		Control Group, F.D.		Control Behavior	
	Est.	S.E.	Est.	S.E.	Est.	S.E.
Same parameters as...	Model A.7		Model A.8		Model A.9	
Opportunity to lead	0.015***	(0.004)	0.015**	(0.005)	0.007**	(0.003)
Trained	-0.446	(1.132)	-0.973	(1.259)	-1.237+	(0.640)
Experience breadth	0.055	(0.063)	0.019	(0.072)	0.064+	(0.039)
Trained * Experience breadth	-0.161+	(0.097)	-0.107	(0.105)	0.009	(0.056)
Opportunity to lead * Trained	-0.014*	(0.006)	-0.013+	(0.007)	0.002	(0.004)
Opportunity to lead * Exper. breadth	-0.001	(0.001)	-0.001	(0.001)	-0.001	(0.001)
Opportun. * Trained * Exper. breadth	0.003**	(0.001)	0.002+	(0.001)	0.000	(0.001)
Log likelihood	-704.5		-851.4		-1606.2	
AIC	1506.9		1767.4		3277.8	
Observations	781		781		1454	
Leaders	122		122		73	

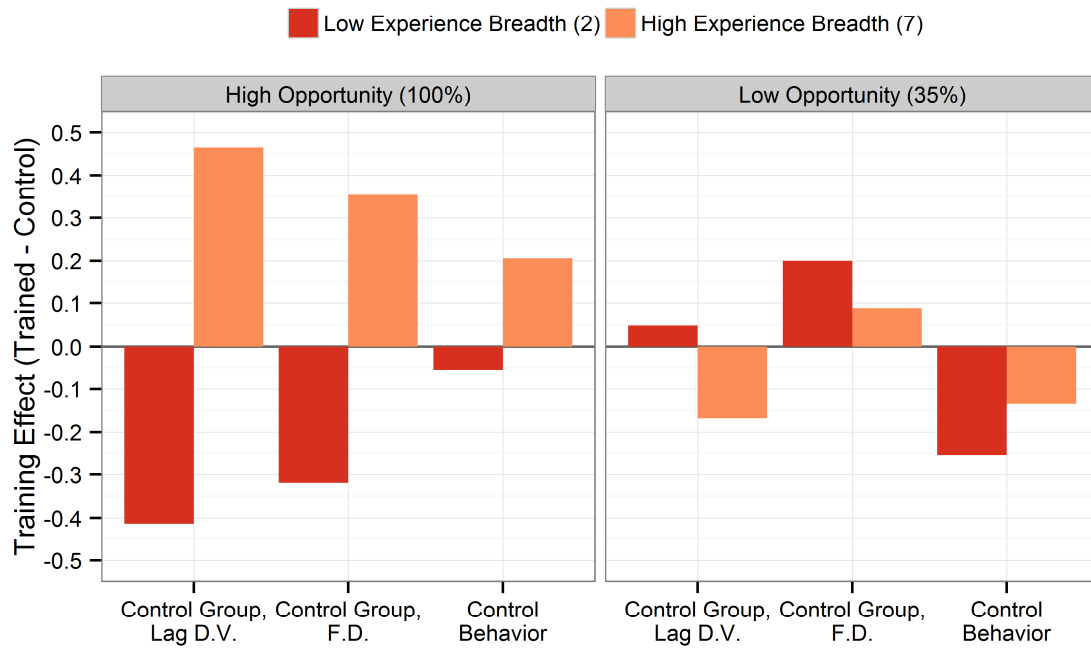
+ $p < .10$, * $p < .05$, ** $p < .01$, *** $p < .001$; two tailed tests.

fact that those who were trained and had an opportunity to lead but had no breadth of experience improved less than similar leaders who were not trained. Model A.12, which only included trained leaders, did not use the same counterfactual (i.e., it used control behaviors instead of a control group) and did not provide evidence of a three-way interaction. Thus, the three-way interaction was specific to using the control group for comparison.

Figure 10 illustrates the predicted impact of experience breadth based on Models A.10, A.11, and A.12. The figure is read by comparing the height of the darker bar (low breadth of experience) to the height of the adjacent lighter bar (high breadth of experience). I focus on the left-hand high-opportunity plot as it is the most pertinent for understanding the training effect. For each model, those who only had experience with two of the nine leadership situations improved less than the control, whereas those who had experienced seven of the nine situations improved more than the control. The difference is starkest for the lagged model wherein those with low experience improved less than the control group by 0.40 points on the leadership scale, whereas those with high experience improved 0.45 more than the control group. The predicted difference for the control behavior model is smaller but follows the same pattern as the other two models.

Taken together, there was ample evidence that leadership training was beneficial for those who had broader leadership experience, and there was additional evidence that the benefits were

Figure 10. Predicted effect of training, experience (breadth), and opportunity to lead.



concentrated in those with both broader leadership experience and the opportunity to lead after training. However, there was no evidence leaders with greater depth benefitted from training. If anything, greater depth of experience led to less benefit from training.

Moderating Effect of Other Individual Characteristics

Hypotheses 3a, 4a, 5a, and 6a posit that leaders with greater cognitive ability, motivation to lead, learning goal orientation, and pre-training self-efficacy, respectively, will benefit more from training. The models in Table 9 and Table 10 provided some support for Hypotheses 4a (motivation to lead) and 5a (learning goal orientation), but did not support Hypotheses 3a (cognitive ability) and 6a (pre-training self-efficacy).

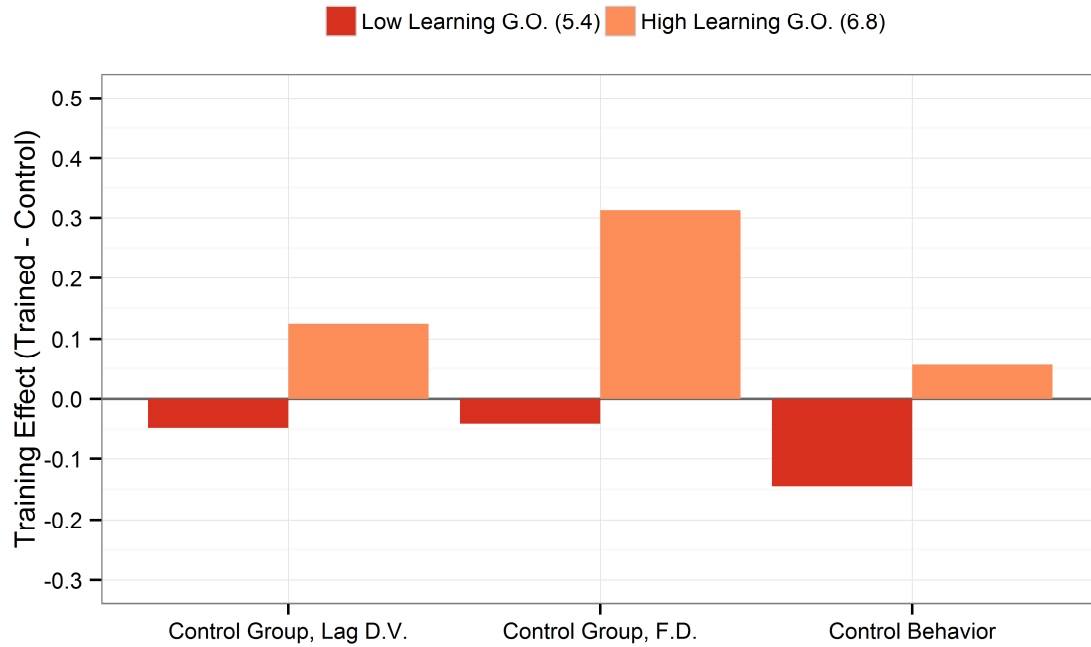
The estimates of the moderating impact of cognitive ability in Models A.4(4) to A.6(4) in Table 9 were near zero in all models ($\beta = -0.007$, $p = n.s.$; $\beta = -0.010$, $p = n.s.$; $\beta = 0.006$, $p = n.s.$). The same was true for the corresponding estimates for cognitive ability in Models A.7 to A.9 in Table 10. The estimates of the effect of cognitive ability for the control group were also near zero,

suggesting that cognitive ability was not associated with improved leadership in any meaningful way. Thus, Hypothesis 3a was not supported.

Motivation to lead was measured on both affective and calculative dimensions. The bivariate correlations in Table 6 show that the two were slightly negatively correlated ($r = -0.17$). Like experience breadth and depth, affective and calculative motivation to lead were entered together in Models A.4(5) to A.6(5) in Table 9 because they are conceptually paired. Model A.6(5), which used control behaviors, shows that leaders with greater affective motivation benefitted more from training ($\beta = 0.134, p < .05$) than leaders with greater calculative motivation ($\beta = 0.056, p = n.s.$). However, in Model A.9 in Table 10, calculative motivation is also shown to have a positive moderating effect ($\beta = 0.118, p = .05$). Entering different combinations of moderating variables in the regression indicated the positive effect of calculative motivation to lead is masked in Model A.6(5) due to common negative correlation with number of projects led and the dependent variable. That is, once the moderating effect of the number of projects led was controlled for, the moderating effect of calculative motivation to lead became apparent. The estimated moderating effect of calculative and affective motivation to lead in Model A.9 were very similar. A likelihood ratio test that compared Model A.9 to a model that combined the motivation dimensions showed the two had the same magnitude of effect ($\chi^2 = 4.46, d.f. = 2, p = n.s.$). Thus, although the two dimensions of motivation were clearly distinct based on their bivariate correlation, they had the same impact on whether training was beneficial for leaders. However, these supporting results are only found for models that used the control behaviors, not the control group. Neither Models A.4(5) and A.5(5) in Table 9 nor Models A.7 and A.8 in Table 10 show a moderating effect for affective or calculative motivation to lead. Thus, there was some support for Hypothesis 4a, but some uncertainty remains because not all models supported the hypothesis.

In support of Hypothesis 5a, leaders with greater learning goal orientation benefitted more from leadership training. The moderating effect was significant in both Model A.6(6) in Table 9 ($\beta = 0.149, p < .05$) and Model A.9 in Table 10 ($\beta = 0.147, p < .05$). The effect was also significant in the first-difference Model A.8 in Table 10 ($\beta = 0.257, p < .05$). The effect was not significant in the first-difference Model A.5(6) in Table 9 ($\beta = 0.022, p = n.s.$), which did not include other moderating effects. Additional analysis found that self-efficacy, affective motivation to lead, and experience depth all possessed a common negative correlation with learning goal orientation and the dependent variable such that, when they were not accounted for, the effect of learning goal orientation was suppressed in Model A.5(6). Controlling for these other moderators, the effect of learning goal orientation became manifest in Model A.8. Notice that the standard error for the

Figure 11. Predicted effect of training and learning goal orientation.



moderating effect of learning goal orientation did not increase appreciably from Model A.5(6) to Model A.8 (0.127 vs. 0.130), indicating that variance inflation was not involved. The moderating effect in lagged Model A.7 was not significant ($\beta = 0.126$, $p = n.s.$), but the coefficient estimate is in line with same coefficient estimate in the control behavior Model A.9 ($\beta = 0.147$). Taken together, the models suggest that a one-point increase in learning goal orientation is associated with a 0.13 to 0.26 increase in leadership behaviors compared to the control, depending on the model used. Figure 11 depicts this prediction in graphical form. The figure illustrates that leaders with lower learning goal orientation (5.4 out of 7) were predicted to improve about 0.05 less than the control group for lagged and first-difference models, whereas leaders with greater learning goal orientation (6.8 out of 7) were predicted to improve between 0.12 and 0.31 more than the control group. For the control behavior model, leaders with low learning goal orientation were predicted to improve trained behaviors 0.15 less than non-trained behaviors, whereas those with greater learning goal orientation were predicted to improve trained behaviors 0.06 more. Note that the

control behavior model predicted lower effects because the main effect of training in Model A.3 was slightly negative.

No support was found for Hypothesis 6a, which posited a positive moderating effect of pre-training self-efficacy. Models A.4(7) to A.6(7) in Table 9 and Models A.7 to A.9 in Table 10 show that the moderating effect of self-efficacy was not significant.

Supplementary Analysis

Table 12 presents alternative models to Model A.7 that provide evidence that the choices made while setting up the sample and specifications did not significantly impact the estimates. Model A.13 includes all controls available, Model A.14 drops leaders from the sample who were flagged as potentially careless responders, and Model A.15 drops leaders in the control group who led more than 40 projects. As shown in the table, the estimates change very little compared to Model A.7. Although not shown, I also estimated these supplementary models for the first-difference specification and control behavior specification, and they returned results very similar to Models A.8 and A.9. Thus, the supplementary analysis supports the existing findings.

One concern that may be raised about the self-report sample is that the dependent variables and the independent variables were collected from the same person, raising the potential for common method bias (Podsakoff, MacKenzie, Lee, & Podsakoff, 2003). However, it is improbable that this was a problem. First, the independent variables were collected in the first time period, and the dependent variables were collected over time, leaving a six- or twelve-week gap between measurements of IVs and DVs. Second, the specifications account for autocorrelation and unobserved attributes of responders that would generate common method bias effects. Third, H2a through H6a are moderating hypotheses, which are not susceptible to common methods bias (Evans, 1985; Siemsen, Roth, & Oliveira, 2010).

Another concern is that since the treatments were not blind, trained leaders may have inflated their scores due to a self-enhancement bias (Taylor, Russ-Eft, & Taylor, 2009). However, there is little evidence of such bias. First, there was a five-week lag between training and post-training measures, providing some time for the salience and immediacy of the training to wane, reducing the likelihood of self-enhancement bias. Second, the regression results in Table 8 provide very modest evidence of a training effect, which is where the self-enhancement bias would appear. Third, the control behavior specification, which only looks at trained leaders, would account for this concern (Taylor et al., 2009). Fourth, this is a concern for the main effect of training (H1a), but would not affect the estimation of the moderating hypotheses.

Table 12. Alternative lagged DV models: leader perspective.

	Model A.13		Model A.14		Model A.15	
	Control Group, Lag Est.	S.E.	Control Group, Lag Est.	S.E.	Control Group, Lag Est.	S.E.
Same controls as...	Model A.1		Model A.1		Model A.1	
Percent audit vs. tax	0.002	(0.002)				
Conscientiousness	0.086	(0.103)				
Extraversion	0.011	(0.072)				
Openness to experience	-0.063	(0.066)				
Supervisory support	0.009	(0.054)				
CPA (1 = yes)	-0.023	(0.102)				
Tenure (years)	0.121	(0.120)				
Region dummies	Included					
Weekly hours worked	0.013	(0.010)				
Log no. of projects led	-0.226*	(0.089)	-0.224**	(0.082)	-0.162+	(0.094)
Log total months leading	-0.028	(0.101)	-0.055	(0.093)	-0.111	(0.099)
Experience breadth	-0.038	(0.034)	-0.021	(0.030)	-0.024	(0.030)
Experience depth	-0.030	(0.106)	0.029	(0.099)	0.022	(0.100)
Cognitive ability	0.006	(0.019)	0.002	(0.017)	0.009	(0.018)
Affective motivation to lead	-0.046	(0.091)	-0.005	(0.080)	-0.015	(0.079)
Calculative motivation to lead	-0.031	(0.073)	-0.083	(0.063)	-0.046	(0.066)
Learning goal orientation	0.137	(0.095)	0.088	(0.080)	0.079	(0.078)
Self-efficacy at week 0	0.091+	(0.053)	0.077	(0.048)	0.103*	(0.050)
Trained	-0.210	(1.230)	-0.662	(1.156)	-0.321	(1.217)
Trained * Log no. of projects led	0.388**	(0.128)	0.390***	(0.115)	0.368**	(0.122)
Trained * Log total months leading	-0.039	(0.135)	-0.024	(0.124)	0.010	(0.129)
Trained * Experience breadth	0.074+	(0.045)	0.075+	(0.042)	0.081+	(0.041)
Trained * Experience depth	-0.117	(0.140)	-0.129	(0.134)	-0.095	(0.136)
Trained * Cognitive ability	-0.027	(0.026)	-0.015	(0.023)	-0.027	(0.024)
Trained * Affective motivation to lead	0.059	(0.128)	-0.013	(0.118)	-0.019	(0.111)
Trained * Calculative motiv. to lead	0.036	(0.097)	0.069	(0.090)	0.048	(0.090)
Trained * Learning goal orientation	0.094	(0.128)	0.131	(0.124)	0.115	(0.120)
Trained * Self-efficacy at week 0	-0.127+	(0.072)	-0.093	(0.062)	-0.092	(0.062)
Log likelihood	-686.8		-678.7		-686.2	
AIC	1490.0		1448.8		1463.8	
Observations	761		749		755	
Leaders	119		117		118	

+ p < .10, * p < .05, ** p < .01, *** p < .001; two tailed tests.

There may also be some concern with the significant finding for Hypothesis 2a because the estimation of the effect of the number of projects led was significant and negative for the control group (Model A.7: $\beta = -0.229$, $p < .01$). However, a negative estimate was not unexpected. Recall that in

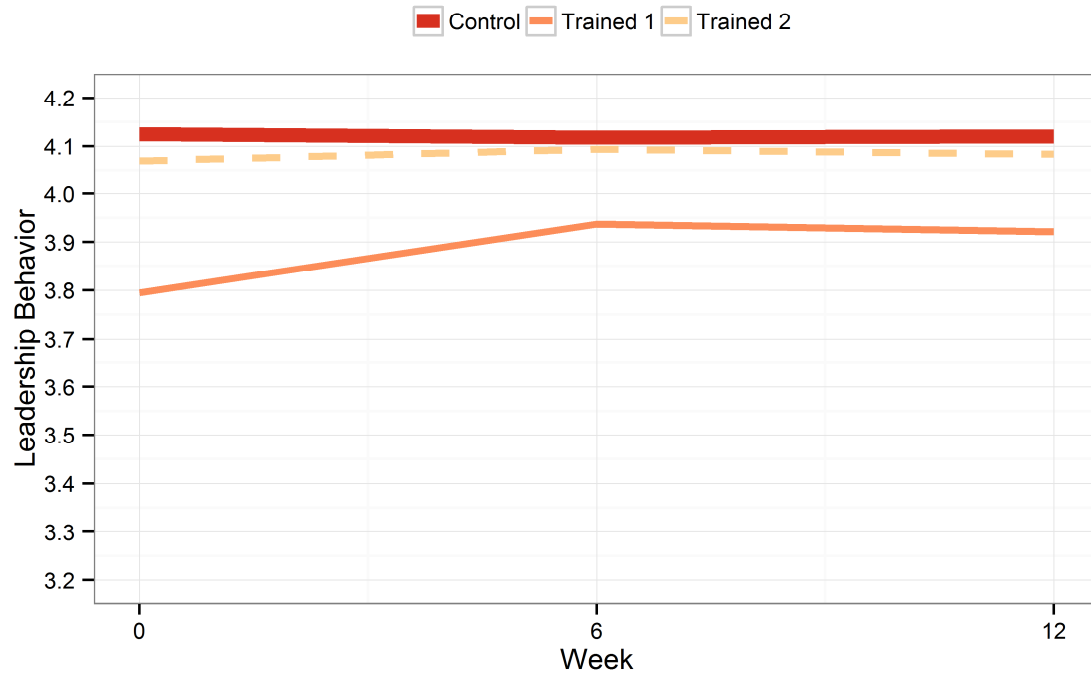
Table 7 the relationship between number of projects led and leadership behaviors was positive and significant ($\beta = 0.316$, $p < .001$). These results suggest that experience and leadership behaviors were following the expected learning curve. Leaders with more accumulated experience had greater leadership ability, which was captured in Table 7, but their *increase* in leadership behaviors was slower than those with less experience. That is why the negative estimate for the control group in Model A.7 and A.8 is not surprising.

Finally, there may be some concern that the leadership training did not lead to the significant findings, but it was the broader four-day training in which the leadership module was embedded. There are three reasons that this is improbable. First, the remaining training modules that leaders received taught specific tax and audit principles. The classes were technical in nature and did not deal with the leadership principles taught in the leadership module. Second, the results found using the control group were also replicated when comparing to control behaviors. If the broader four-day training conference impacted leadership behaviors generally, I would not expect to find the distinction between the trained and non-trained behaviors that appeared in Model A.9. Third, fourteen leaders in the control group also received a four-day technical training during the summer either at the level below or level above, but the other levels did not include the leadership training. I assigned the fourteen leaders to the trained group instead of the control group and reestimated Model A.7. The AIC was higher when the fourteen leaders were considered trained (AIC = 1520.7) than the AIC for Model A.7 (AIC = 1510.3), indicating that the fourteen leaders that also received technical training (but no leadership training) did not fit well with the group of leaders trained in leadership specifically. This suggests that the training module drove the significant results, not the broader training conference.

Summary of Leader Perspective

Results from the leader sample provided limited support for a main effect of training (H1a). The estimated training effect ranged from -0.06 to +0.22 depending on the model specification and control. In practical terms, the overall training effect was nil to small. However, there was robust evidence that some leaders benefitted much more from training than others. Leaders who had led more projects or who had greater exposure to a breadth of leadership situations benefitted more from training than those with less experience. At the same time, those who had led more months or had greater depth of experience did not benefit more from training, and, controlling for projects led and breadth of experience, may have actually improved less than the control group—an intimation that would need to be investigated further to settle.

Figure 12. Leadership behaviors over time: subordinate perspective.



The results also provided fairly strong evidence that leaders with a stronger learning goal orientation benefitted more from training. Modest evidence also suggested that leaders with greater motivation to lead gained more from training. However, no support was found for the moderating effect of cognitive ability and pre-training self-efficacy.

Subordinate Perspective

Estimating the effect of leader training using the perspective of leaders' subordinates offers the advantage of having outside observers who are directly impacted by the leaders' behaviors rate the leader. However, this sample has serious limitations. Because of the difficulty encountered matching subordinate responses with sample leaders, many of the subordinate surveys were not usable. In the end, responses for only 46 leaders were usable—23 for the control group and 23 for the trained group. For 11 of the 46 leaders, the same subordinate was not rating the leader across

Table 13. Main effect of training: subordinate perspective.

	Model B.1		Model B.2		Model B.3	
	Control Group, Lag		Control Group, F.D.		Control Behavior	
	Est.	S.E.	Est.	S.E.	Est.	S.E.
(Intercept)	2.396***	(0.618)	0.199	(0.503)	3.821***	(0.474)
Leadership at week 0	0.292***	(0.051)				
Leadership behavior dummies	Included		Included			
Leadership behavior (1 = training)					-0.085	(0.062)
Trained Group 2					0.167	(0.145)
Industry dummies	Included					
Hire quarter dummies	Included					
Senior associate	0.171	(0.155)				
Week 6					0.006	(0.184)
Week 12	0.034	(0.133)	0.040	(0.130)	0.015	(0.194)
Agreeableness (subordinate)	0.151	(0.124)	0.013	(0.103)	0.057	(0.100)
Relationship months (subordinate)	0.019*	(0.010)	0.015+	(0.009)	0.005	(0.016)
Opportunity to lead	-0.009**	(0.003)	-0.004	(0.003)	-0.003	(0.003)
Trained	-0.146	(0.173)	-0.023	(0.137)	0.036	(0.088)
Log likelihood	-332.0		-415.1		-510.8	
AIC	719.4		857.0		1050.4	
Observations	432		432		564	
Leaders	46		46		23	

+ p < .10, * p < .05, ** p < .01, *** p < .001; two tailed tests.

all time periods. I continue with the analysis as planned but add a caution that the results are tenuous given the small sample size.

Main Effect of Training

Figure 12 depicts the leadership behaviors of leaders based on the subordinate perspective. The control group behaviors remained flat over time. The leader behaviors of Trained Group 1 increased somewhat from week 0 to week 6, which is the period in which they were trained. The leadership behaviors of Trained Group 1 remained flat in the next period. The leadership behaviors of Trained Group 2 were flat like the control group from week 0 to week 6 (at which point they had not yet been trained), but their leadership behaviors remained flat as well from week 6 to week 12, the period during which they were trained.

Table 13 presents the estimates for the main effect of training. The lagged specification in Model B.1 ($\beta = -0.146$, $p = n.s.$), the first-difference specification in Model B.2 ($\beta = -0.023$,

Table 14. Moderating effects entered individually: subordinate perspective.

	Model B.4(X)		Model B.5(X)		Model B.6(X)	
	Control Group, Lag Est.	S.E.	Control Group, F.D. Est.	S.E.	Control Behavior Est.	S.E.
Trained (1)	0.824+	(0.445)	0.733+	(0.419)	0.047	(0.200)
Log no. of projects led	0.210+	(0.125)	0.090	(0.082)	-0.218*	(0.092)
Trained * Log no. of projects led	-0.433*	(0.179)	-0.300+	(0.156)	-0.005	(0.072)
Trained (2)	0.527	(0.717)	0.844	(0.625)	0.392	(0.307)
Log total months leading	0.175	(0.138)	0.161+	(0.097)	0.158	(0.129)
Trained * Log total months leading	-0.252	(0.260)	-0.307	(0.216)	-0.129	(0.106)
Trained (3)	-0.366	(0.689)	0.444	(0.622)	0.277	(0.309)
Experience breadth	-0.022	(0.040)	0.022	(0.035)	0.017	(0.039)
Experience depth	-0.050	(0.140)	-0.046	(0.107)	0.062	(0.114)
Trained * Experience breadth	-0.046	(0.076)	-0.006	(0.069)	-0.036	(0.033)
Trained * Experience depth	0.153	(0.216)	-0.161	(0.191)	-0.021	(0.094)
Trained (4)	1.260	(1.261)	1.160	(1.051)	0.132	(0.536)
Cognitive ability	0.011	(0.024)	-0.002	(0.017)	0.009	(0.023)
Trained * Cognitive ability	-0.051	(0.046)	-0.043	(0.040)	-0.005	(0.020)
Trained (5)	-1.981*	(0.881)	-0.045	(0.938)	-0.624	(0.456)
Affective motivation to lead	-0.073	(0.095)	-0.056	(0.091)	0.050	(0.073)
Calculative motivation to lead	0.171+	(0.093)	0.067	(0.077)	0.115+	(0.067)
Trained * Affective motivation to lead	0.292*	(0.134)	-0.020	(0.141)	0.070	(0.068)
Trained * Calculative motiv. to lead	0.103	(0.152)	0.053	(0.154)	0.122+	(0.074)
Trained (6)	-2.772*	(1.354)	-0.002	(1.196)	-2.113***	(0.627)
Learning goal orientation	0.074	(0.121)	0.164+	(0.095)	0.125	(0.154)
Trained * Learning goal orientation	0.468*	(0.239)	0.002	(0.206)	0.377***	(0.109)
Trained (7)	-2.051*	(0.933)	-1.151	(0.813)	-1.001*	(0.417)
Self-efficacy at week 0	-0.050	(0.069)	-0.032	(0.055)	0.054	(0.081)
Trained * Self-efficacy at week 0	0.296*	(0.141)	0.174	(0.126)	0.166*	(0.066)

Models include the same controls as Model B.1, B.2, and B.3.

+ $p < .10$, * $p < .05$, ** $p < .01$, *** $p < .001$; two tailed tests.

$p = n.s.$), and the control behavior comparison in Model B.3 ($\beta = 0.036$, $p = n.s.$) all show no effect of training. Models B.2 and B.3 show an almost zero effect while Model B.1 shows a slight negative main effect of training. Overall, the subordinate perspective does not support Hypothesis 1b.

Moderating Effect of Experience

Table 14 presents the effect of the moderating variables. Because the sample size is small, I added the moderating impact of the moderating variables individually for the leader perspective and did not add all of the moderators at once. I attempted to do so with the subordinate data, but the standard errors became substantially inflated, so I was doubtful of the credibility of the estimated results.

Thus, I report the moderating results recognizing that the effect of one moderator includes the shared variance of the often-related other moderators.

For Hypothesis 2b, the results provide some evidence opposite to the posited effect for number of projects led. In Models B.4(1) and B.5(1), the leadership behaviors of leaders who had led more projects improved *less* than the control group leaders with similar experience ($\beta = -0.433$, $p < .05$; $\beta = -0.300$, $p < .10$). For Model B.6(1), which used control behaviors for comparison, no moderating effect was found for number of projects led. For the other measures of experience, there was no evidence of a moderating effect. Models B.4(2) to B.6(2) tested the moderating effect of number of months leading, and Models B.4(3) to B.6(3) tested the moderating effect experience breadth and depth. None of the estimates in these models were significant. Thus, Hypothesis 2b was not supported.

Because the moderating effect of the number of projects led was significant and positive from the leader perspective but significant and negative from the subordinate perspective, it is important to try to reconcile the two. I did so in two ways. First, I used the subset of 40 leaders that were common to both samples to see if the regression estimates were similar. If the estimates of the moderating effect converged for the common subsample, then the original divergent findings would be best explained by the differences in the samples. However, if the estimates remained divergent for the common subsample, then the differences would be best explained by differences in perspective between the leaders and subordinates. I reestimated Model A.4(1) and B.4(1) using the 40 common leaders. The moderating effect of the number of projects led for the Model A.4(1) subsample was 0.261 ($t\text{-value} = 1.38$). The corresponding effect for the Model B.4(1) subsample was -0.548 ($t\text{-value} = -2.45$), a difference of 0.809. In the original models with full samples, the difference in the estimates of the moderating effect was 0.837. Thus, the difference in the estimates was reduced a little by using the common subsample, but the perspectives still remained divergent. Second, I looked for outliers that might impact the small subordinate sample. I found that two leaders drove the negative moderating result. One leader led one project and another led two projects; the other 44 leaders in the subordinate sample led more than two projects. When those two leaders were omitted from the sample, the moderating effect increased from -0.433 in Model B.4(1) to +0.010 ($p = n.s.$). The same two leaders appeared in the subsample of 40 common leaders. When they were omitted, then the estimate of the moderating effect for the 38 common leaders was +0.149 ($t\text{-value} = 0.42$) for the subordinate-rated sample and +0.602 ($t\text{-value} = 2.46$) for the self-rated sample—a difference of only 0.453. In all, the additional analysis demonstrated that the negative moderating effect was dependent on two leaders in the subordinate-rated sample, which

makes the finding highly tenuous. Without the two leaders, the negative moderating effect disappeared and a substantial portion of the divergence in perspective was eliminated. Yet, the distance was not fully traversed: the leader self-rated sample still predicted that leaders benefit more from training when they have led more projects while the subordinate perspective predicted no benefit.

Moderating Effect of Other Individual Characteristics

No evidence was found that leaders with greater cognitive ability benefitted more from training. The estimates of the moderating effect of cognitive ability in Models B.4(5) to B.6(5) were not significant. Thus, Hypothesis 3b was not supported.

Like the leader perspective, there was mixed evidence that leaders with greater motivation to lead benefitted more from training. The estimate of the moderating effect of affective motivation to lead in Model B.4(5) was positive and significant ($\beta = 0.292, p < .05$). However, the moderating effect was not significant in Models B.5(5) ($\beta = -0.020, p = n.s.$) nor B.6(5) ($\beta = 0.070, p = n.s.$). For calculative motivation to lead, the moderating effect was marginally significant in Model B.6(5) ($\beta = 0.122, p < .10$) but was not significant in Models B.4(5) ($\beta = 0.103, p = n.s.$) nor B.5(5) ($\beta = 0.053, p = n.s.$). Thus, there is limited support for Hypothesis 4b.

There is stronger evidence that leaders with greater learning goal orientation benefitted more from training. The estimates of the moderating effect of learning goal orientation in Models B.4(6) ($\beta = 0.468, p < .05$) and B.6(6) ($\beta = 0.377, p < .001$) were significant. However, the first-difference estimate in Model B.5(6) was not significant ($\beta = 0.002, p < n.s.$). Taken together, the models provide mixed support for Hypothesis 5b, but when combined with the findings from the leader perspective (H5a), they provide quite robust evidence that leaders with a stronger learning goal orientation benefit more from leadership training.

The subordinate perspective also provides evidence that leaders with greater pre-training self-efficacy benefit more from training, which supports Hypothesis 6b. The estimates of the moderating effect of self-efficacy in Models B.4(7) and B.6(7) were positive and significant ($\beta = 0.296, p < .05$; $\beta = 0.166, p < .05$). The estimate for Model B.5(7) was not significant ($\beta = 0.174, p = n.s.$), but it falls between the estimates of the lagged model and control behaviors model. Although Hypothesis 6b is supported, some caution should be taken because of the sample size.

Summary of Subordinate Perspective

From the subordinate perspective, trained leaders did not improve in their leadership more than non-trained leaders, so Hypothesis 1b was not supported. Contrary to expectations, some evidence suggested that leaders who had led more projects benefitted *less* from training compared to the control group. However, the negative finding is wholly dependent on two leaders, making the negative finding tenuous. Nonetheless, Hypothesis 2b was not supported. There was also no support for Hypothesis 3b regarding cognitive ability.

Some limited support was found for motivation to lead (H4b). Leaders with greater affective and calculative motivation to lead benefitted more training in some models, but not others. Mixed support was found for the moderating impact of learning goal orientation (H5b) and strong support was found for Hypothesis 6b, that pre-training self-efficacy amplifies the benefit of training.

Manager Perspective

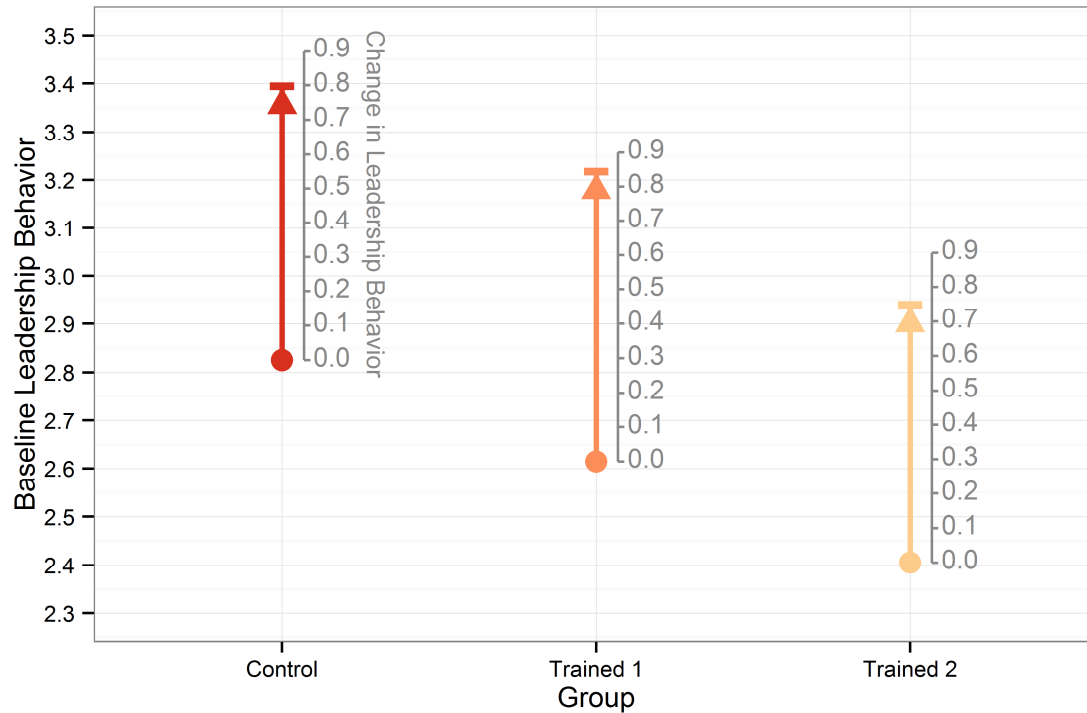
I was only able to survey managers once, so I asked them to retrospectively provide the *change* in leadership behaviors they have observed in the project leaders they manage. Because they provided change values, unstandardized estimates were not directly comparable to the subordinate ratings and leader self-ratings, but the hypothesis tests can still be performed. Also, because the data is cross-sectional, I cannot use the same specifications as those used with the panel data. However, the control behavior specification for the manager sample provided the same benefits of a within-person comparison as found in the leader and subordinate samples.

Main Effect of Training

Figure 13 illustrates the retrospective rating of change in leadership behaviors. The y-axis is the leadership behavior of the leaders at the beginning of the study period (rated retrospectively), and the axes within the figure is the rating of change, zero being no change. As illustrated, Trained Group 1 changed slightly more than the control group (0.85 vs. 0.80), but Trained Group 2 changed slightly less (0.75 vs. 0.80).

Table 15 presents the main effect of training. In both the control group and control behavior models, the training effect was positive but not significant ($\beta = 0.066$, $p = n.s.$; $\beta = 0.040$, $p = n.s.$). Thus, Hypothesis 1c was not supported.

Figure 13. Retrospective change in leadership behaviors: manager rating.



Moderating Effect of Experience

Table 16 presents the estimates of the moderating effects entered individually into the model. Table 17 presents the estimates of the moderating effects entered together. There is some mixed evidence that leaders who had led more months benefitted more from training. The estimated moderating effect in Model C.3(2) was positive and significant ($\beta = 0.443$, $p < .05$), and it remained significant in Model C.5 when the other moderators were added to the model ($\beta = 0.666$, $p < .05$). However the corresponding estimates in Model C.4(2) (control behavior) in Table 16 and Model C.6 in Table 17 were not significant ($\beta = 0.024$, $p = n.s.$; $\beta = -0.051$, $p = n.s.$). No other experience measures (i.e., number of projects led, experience breadth, experience depth) were significant. Thus, there was some limited support for Hypothesis 2c.

Table 15. Main effect of training: manager perspective.

	Model C.1		Model C.2	
	Control Group Est.	S.E.	Control Behavior Est.	S.E.
(Intercept)	4.247***	(0.671)	4.329***	(0.384)
Leadership behaviors (base)	-0.068	(0.057)	-0.044	(0.042)
Lead. behav. (base) * Developing	0.242**	(0.084)		
Leadership behavior dummies	-0.528*	(0.227)		
Industry dummies	Included			
Hire quarter dummies	Included			
Senior associate	0.102	(0.189)		
Observation extent (manager)	0.197*	(0.083)	0.170*	(0.082)
Opportunity to lead	-0.001	(0.003)	0.000	(0.003)
Trained	0.066	(0.186)	0.040	(0.063)
Log likelihood	-453.9		-645.6	
AIC	961.3		1307.4	
Observations	398		541	
Leaders	107		72	

+ $p < .10$, * $p < .05$, ** $p < .01$, *** $p < .001$; two tailed tests.

Moderating Effect of Other Individual Differences

Models C.3(4) and C.4(4) in Table 16 indicate that cognitive ability had no moderating impact on training. Also Models C.5 and C.6 in Table 17 provide no evidence of a moderating impact. Thus, Hypothesis 3c was not supported. Models C.3(5) and C.4(5) in Table 16 and C.5 and C.6 in Table 17 indicate that affective and calculative motivation to lead had no moderating impact. Thus, Hypothesis 4c was not supported. Model C.4(6) indicates that the trained behaviors of leaders with stronger goal orientation improved more than non-trained behaviors ($\beta = 0.207$, $p < .05$), and the effect remained when other moderators were included in Model C.6 ($\beta = 0.183$, $p < .10$). However, the estimates of the moderating impact of learning goal orientation in Models C.3(6) ($\beta = -0.131$, $p = n.s.$) and C.5 ($\beta = -0.262$, $p = n.s.$) were not significant. Overall, there was mixed support for Hypothesis 5c. Models C.3(6) and C.4(6) in Table 16 and Models C.5 and C.6 in Table 17 provide no evidence of a moderating impact of pre-training self-efficacy. Thus Hypothesis 6c was not supported.

Table 16. Moderating effects entered individually: manager perspective.

	Model C.3(X)		Model C.4(X)	
	Control Group		Control Behav.	
	Est.	S.E.	Est.	S.E.
Trained (1)	0.077	(0.559)	-0.200	(0.166)
Log no. of projects led	-0.039	(0.188)	-0.169	(0.105)
Trained * Log no. of projects led	0.016	(0.225)	0.106	(0.078)
Trained (2)	-1.217*	(0.562)	-0.051	(0.155)
Log total months leading	-0.490**	(0.174)	-0.074	(0.069)
Trained * Log total months leading	0.443*	(0.183)	0.024	(0.057)
Trained (3)	0.032	(0.692)	-0.107	(0.280)
Experience breadth	-0.085	(0.056)	-0.070+	(0.038)
Experience depth	-0.084	(0.192)	-0.045	(0.127)
Trained * Experience breadth	0.033	(0.068)	0.030	(0.027)
Trained * Experience depth	-0.006	(0.247)	-0.006	(0.094)
Trained (4)	0.843	(1.316)	-0.573	(0.490)
Cognitive ability	0.032	(0.041)	-0.015	(0.025)
Trained * Cognitive ability	-0.026	(0.048)	0.022	(0.019)
Trained (5)	-0.223	(1.077)	-0.417	(0.461)
Affective motivation to lead	0.065	(0.138)	-0.087	(0.099)
Calculative motivation to lead	-0.069	(0.175)	0.119	(0.088)
Trained * Affective motivation to lead	0.050	(0.167)	0.112	(0.076)
Trained * Calculative motiv. to lead	0.047	(0.197)	-0.075	(0.065)
Trained (6)	0.925	(1.279)	-1.250*	(0.546)
Learning goal orientation	0.057	(0.163)	-0.280*	(0.117)
Trained * Learning goal orientation	-0.131	(0.208)	0.207*	(0.089)
Trained (7)	0.300	(0.707)	-0.146	(0.313)
Self-efficacy at week 0	-0.046	(0.095)	-0.134*	(0.059)
Trained * Self-efficacy at week 0	-0.023	(0.109)	0.024	(0.048)

Models include the same controls as Model C.1, C.2, and C.3.

+ $p < .10$, * $p < .05$, ** $p < .01$, *** $p < .001$; two tailed tests.

Summary of Manager Perspective

The manager perspective provides little evidence of any main or moderated effect of training. There was limited support for Hypothesis 2c that leaders who have led for more months benefitted more from training, but the effect was not consistent across models. There was also mixed support for Hypothesis 5c—that leaders with a stronger learning goal orientation benefitted more from training. However, H1c, H3c, H4c, and H6c were not supported.

Table 17. All moderating effects: manager perspective.

	Model C.5		Model C.6	
	Control Group Est.	S.E.	Control Behavior Est.	S.E.
Same controls as...	Model C.1		Model C.2	
Trained	2.304	(2.428)	-0.848	(0.927)
<i>Effect on control group / behavior</i>				
Log no. of projects led	0.153	(0.221)	-0.204	(0.142)
Log total months leading	-0.548*	(0.252)	0.172	(0.110)
Experience breadth	-0.015	(0.084)	-0.098*	(0.047)
Experience depth	-0.103	(0.245)	-0.083	(0.126)
Cognitive ability	0.014	(0.048)	-0.009	(0.025)
Affective motivation to lead	0.084	(0.165)	-0.007	(0.114)
Calculative motivation to lead	-0.078	(0.201)	0.064	(0.093)
Learning goal orientation	0.084	(0.209)	-0.222+	(0.131)
Self-efficacy at week 0	0.115	(0.141)	-0.053	(0.066)
<i>Moderating effect: Difference between trained and control</i>				
Trained * Log no. of projects led	-0.196	(0.268)	0.094	(0.107)
Trained * Log total months leading	0.666*	(0.268)	-0.051	(0.089)
Trained * Experience breadth	-0.087	(0.099)	0.039	(0.037)
Trained * Experience depth	-0.052	(0.298)	-0.038	(0.101)
Trained * Cognitive ability	-0.022	(0.054)	0.019	(0.020)
Trained * Affective motivation to lead	0.051	(0.201)	0.020	(0.096)
Trained * Calculative motiv. to lead	0.043	(0.225)	-0.039	(0.070)
Trained * Learning goal orientation	-0.262	(0.255)	0.183+	(0.104)
Trained * Self-efficacy at week 0	-0.192	(0.150)	-0.023	(0.053)
Log likelihood	-387.0		-529.1	
AIC	872.3		1113.5	
Observations	350		451	
Leaders	94		60	

+ p < .10, * p < .05, ** p < .01, *** p < .001; two tailed tests.

5. DISCUSSION

The aim of this study was to understand how leaders' prior leadership experience as well as their cognitive ability, motivation to lead, learning goal orientation, and self-efficacy impact the effectiveness of leadership training. The study used a quasi-experimental test to compare trained leaders to similar non-trained leaders and also compare leadership behaviors that were specifically trained to behaviors that were not trained. I measured leadership behaviors from the leader, subordinate, and manager perspective. Table 18 summarizes the findings.

The Interplay between Experience and Training

From the leaders' own perspective, prior leadership experience was vital to their ability to benefit from leadership training. Novice leaders obtained no observable benefit from training and actually improved less than novice leaders who were not trained. The positive effect of experience remains even after controlling for the effect of cognitive ability, motivation to lead, learning goal orientation, and self-efficacy. In other words, after accounting for the fact that experienced leaders often had a learning orientation, were motivated to lead, and had greater confidence in their leadership, experience still impacted the effectiveness of training. This result supports the theory that schema constraints restrict the ability of novice leaders to glean insights from behavioral training while experienced leaders are able to utilize the training to improve their leadership skill.

The important measures of experience were the number of projects led, which represents an accumulation of experience over time, and experience breadth, which represents an exposure to diverse leadership situations. Interestingly, the number of months leading and experience depth did not moderate the effectiveness of training. In fact, they were trending negative (though not significant) when controlling for number of projects led and experience breadth. This finding might be signaling the presence of the ceiling effect. That is, leading more projects helps leaders develop the mental schema necessary to benefit from training, but leading for greater lengths of time simultaneously drive the inertial effects that make leaders unwilling to learn from training. Similarly, exposure to a broad array of leadership situations helps leaders develop a readiness to learn from training, but greater depth of experience simultaneously creates a rigidity that limits

Table 18. Summary of findings.

	Perspective		
	Leader	Subordinate	Manager
Experience			
Projects led	+	∅	∅
Months leading	∅	∅	Mixed
Experience breadth	+	∅	∅
Experience depth	∅	∅	∅
Cognitive ability	∅	∅	∅
Motivation to lead	Mixed	Mixed	∅
Learning goal orientation	+	Mixed	Mixed
Self-efficacy	∅	+	∅

+ = Significant positive findings; ∅ = Null findings; Mixed = Mix of significant positive and null findings

learning leadership through training. These secondary negative effects are only visible when controlling for the measures that drive the positive effect of experience since the different measures are positively related to each other. This study only suggests that these simultaneous effects may be a possibility; further research would be needed to draw convincing conclusions.

Another interesting result is that, on average, novice leaders actually improved less than the non-trained group. There may be two explanations for this. First, being in the training may have had an opportunity cost. Non-trained novice leaders may have benefitted more by having the week to work instead of being in the training conference. However, this explanation is unlikely. The control-behavior comparison also found a negative effect (i.e., non-trained leadership behaviors improved more than trained behaviors for novice leaders), which cannot be explained by it. The second and more likely explanation is that training actually *stifled* their ability not only to apply what they learned through training but to continue learning through experience. It is plausible that novice leaders mislearned leadership practices, and their attempts to apply them were fruitless, creating a temporary obstacle in their progression. Such negative mechanism adds another avenue through which the schema constraint is not only limiting but also deleterious. Additional research would be needed to convincingly conclude this additional mechanism is at play.

The subordinate perspective offered no evidence that greater prior leadership experience benefitted trainees, and the manager perspective offered only mixed support that more months leading was beneficial. This raises the question of why the different perspectives lead to different

results. One immediate response may be that the leader self-reports were biased—leaders who were trained simply responded positively after training as a type of self-enhancement bias. However, this rejoinder is too simplistic and does not fit the results. Both the control behavior model and the fact that the experiential effects are moderating effects make it implausible (see the detailed explanation on page 51). Another response may be that the differences are simply driven by the differences in which leaders appeared in the sample and the retrospective design of the manager survey. While the differences in design cannot be ruled out, the differences in which leaders appeared in the sample is an unlikely reason—at least as a full explanation. As described on page 57, even when comparing the leaders common to both the self-rated and subordinate-rated samples, the subordinate sample did not exhibit a positive moderating effect of experience as the leader sample did. Substantial perspective differences appeared even after harmonizing the samples. The most probable explanation for the differences is access to information. Leaders, who are aware of all their attempts to improve their leadership abilities, can provide a more nuanced response to their leadership behaviors. Subordinates work closely with leaders, but often for only brief periods. Many projects only last two to five days before subordinates move on to new projects with new leaders. In that time subordinates may only get a glimpse of the changes a leader makes over a five-week window. Managers often do not work directly on projects with leaders, so their access to information may be limited or filtered through others. The leadership training was brief, so large, conspicuous changes were unlikely. Yet it could readily produce smaller changes more perceptible to the leader or careful observers but beyond the purview of many subordinates and managers.

Other Important Individual Characteristics

Among the four individual characteristics tested—cognitive ability, motivation to lead, learning goal orientation, and self-efficacy—only learning goal orientation provided fairly consistent evidence of a moderating effect. The effect also appeared for all three perspectives, suggesting it is one of the most robust and prominent individual factors to impact the effectiveness of training. Because of their mastery orientation leaders with this characteristic fully engage in training and apply what they learn in their project leadership. That trained leaders are able to improve faster than non-trained leaders supports the notion that training is providing leaders with expert knowledge or best-practices that are not available to them in their local domain in which on-the-job learning occurs. This result strengthens existing goal orientation research, which has not compared trainees to learners who only learn through on-the-job experience (e.g., Bell & Kozlowski, 2002; Ford et al., 1998).

There was mixed support for the hypothesis that leaders with greater motivation to lead benefitted more from training. Interestingly, both leaders who led for instrumental reasons (i.e., calculative motivation) and those who enjoyed leading (i.e., affective motivation) benefitted from training, even as leaders who were more instrumental were less likely to enjoy leading. Either motivational path was beneficial, though, again, there was mixed support for both.

Contrary to expectations, leaders' self-efficacy and cognitive ability did not impact the effectiveness of training. Self-efficacy was significant as expected in the subordinate sample, but the sample was too small to be too confident in the result. From the leader perspective pre-training self-efficacy benefitted both the trained and non-trained leaders. This result has important implications for prior findings on self-efficacy and training (e.g., Bell & Kozlowski, 2002; Chiaburu & Marinova, 2005; Gist et al., 1991; Hughes et al., 2013; Tracey et al., 2001). While self-efficacy may very well improve training outcomes, it is also beneficial for those learning through on-the-job experience. Thus, there is little evidence that a trainee's self-efficacy will impact the usefulness of offering training to new leaders.

For cognitive ability, there was no evidence of any link to leaders who were trained or leaders who were not trained. The lack of findings suggests a potential boundary condition on the benefit of cognitive ability and training. While cognitive ability can be useful for training in declarative or procedural knowledge domains (Colquitt et al., 2000; Ree & Earles, 1991), it appears to have little impact on interpersonal knowledge domains.

Implications for Theory

This work advances our current understanding of organizational learning and training by explicating the impact of prior experience on training effectiveness. By drawing on diverse literatures in educational and cognitive psychology, training, and organizational theory, I reconcile contrasting arguments for whether prior experience helps or hinders training outcomes. This is accomplished by introducing two separate constraints—the schema constraint and the ceiling constraint—that are always present but that are more or less likely to be the limiting factor for different trainees depending on their incoming level of experience. The introduction of these constraints into this framework is important because theoretical explanations for the timing of training have been absent from the literature. The framework helps us understand *when* training may be most beneficial given individuals' levels of experience. It also creates new opportunities for additional empirical work, such as testing the curvature and slope of the constraints and the optimal levels of experience in different knowledge domains.

The training literature has focused on a number individual characteristics, but experience has not been a focus and rarely has it been conceptualized beyond tenure. This study adds prior experience as an important individual characteristic to consider to understand training outcomes, and it raises the importance of considering different conceptualizations of experience—both measures of accumulated time and measures of breadth and depth of exposure—that can impact training outcomes differently. Experience also proved more important than other individual characteristics, including motivation to lead, cognitive ability, and self-efficacy. It is a fundamental factor to training effectiveness that has been overlooked or taken for granted. This research suggests much more care should be given to trainees' experience when planning the timing of training.

The importance of experience as breadth of exposure highlights new connections with the learning literature. I have argued that insufficient cognitive schema limits the learning novices can acquire from training and found that broader exposure prior to training removes this limitation. This finding aligns with work by Paas and Van Merriënboer (1994) and Schilling and colleagues (2003) who found in their experiments that exposure to a variety of related situations helps develop cognitive schema and improves learning. This work affirms the importance of related variety and newly demonstrates that it is a valuable prerequisite for capitalizing on training outcomes. The importance of the number of projects led highlights the importance of moving down the experience curve somewhat before training. Moving down the experience curve is not just about gaining a breadth of exposure, however, as both exposure breadth and projects led were influential when controlling for the other. Leading projects may provide opportunities to fail or experience problems that leaders do not have solutions for currently. Such leadership experience sets the foundation for truly seeing solutions presented in training. Novice leaders with little project experience may not have problems yet to be solved, and thus miss the solutions provided in training.

Also, there was some evidence that the opportunity to lead immediately following training is vital. Opportunity has been recognized as an important variable in past research (Ford et al., 1992; D. H. Lim & Johnson, 2002), but it has only been viewed as a direct antecedent for training outcomes. In this study I found opportunity also moderates the impact of breadth of experience. This heightens the importance of opportunity because a lack of it can override other characteristics of the individual that would normally lead to a positive outcome. Moreover, it further highlights the importance of inserting training strategically in a leader's learning curve trajectory. The greatest advances along the leadership learning curve occur when training occurs after some experience has been acquired and followed up by ample opportunity to lead.

Finally, the importance of learning goal orientation I find here adds to the groundswell of interest in a growth mindset (a revised nomenclature for learning goal orientation) occurring in education and business. Dweck's work has entered the popular press (Dweck, 2007) and much more emphasis is being placed on interventions to move people toward a learning goal orientation (Heslin & VandeWalle, 2008). This study affirms the importance of a learning goal orientation. The ability to instill such orientation could benefit organizations.

Implications for Practice

There are many situations in which organizations want to provide a single training to employees or managers (e.g., new manager training), but training research has been silent as to when to provide such training. This study indicates that training before any on-the-job experience is gained is apt to be ineffective. Waiting until trainees have garnered some exposure through on-the-job experience is beneficial.

This study supports the existing idea that needs analysis can help identify who would benefit from training, but it also reveals an aspect of needs analysis that has not been emphasized in the past. An important part of readiness for training is identifying the extent to which employees have been exposed to situations that correspond to the training topic. In the case of leadership training, a needs analysis could be improved by using the experience index in this study or one that similarly measures breadth of leadership exposure. In project settings, training leaders could simply ask about the number of projects led. Training leaders could also see how many months a person has been leading, though such a measure likely less accurate concerning training readiness. HR professionals could use this information to identify employees to invite to training.

Further, it is important that trainees be given the opportunity to use their training immediately afterward. Human resource professionals are called to look beyond the training course to ensure that trainees are poised to use their training. If insufficient opportunity exists, it is likely better to delay training or to put forth effort to create opportunities for the trainees. Optimizing training schedules to align with work assignments is ideal.

Limitations

This study was conducted over a 12-week period and focused on leadership skills developed through classroom training in the context of a public accounting firm. Important boundary conditions for the generalization of these findings include the knowledge domain, organizational

context, training context, and time horizon. Leadership behaviors fall within the broader domain of interpersonal skills, and the findings are most relevant within this domain. The theoretical arguments can easily apply to other knowledge domains as well, but care should be taken when making inferences to domains that are primarily declarative or procedural, which were not tested here. The organizational context falls within the general category of professional services; it would be useful to replicate this study in other contexts, such as manufacturing or research and development. Also, the findings do not easily map onto organizational contexts where safety is the primary concern (M. J. Burke et al., 2011), such as for pilots and doctors. In such cases, training is deeply integrated with experiential learning, and the theory would need to be modified and extended for such contexts.

This study focused on classroom-based training. Classroom training continues to be a dominant form of training, but newer models of online, self-paced, and in-situ training exist. Future tests could suggest the extent to which the experience-training interaction holds for these other training contexts. The study also focused on short-term training effects of only several weeks. An important extension to this study would be to map training effects over a longer period of time. Existing meta-analyses have been unable to detect a significant increase or decrease in job behaviors over time (Taylor et al., 2005). What is still unknown is whether training places a person on a new trajectory or learning compared to those not trained or if untrained individuals eventually catch up to trained individuals. Understanding how training impacts a person's longer learning curve is a rich area for future research.

The organizational setting did not allow me to randomize accountants into treatment and control groups. However, I did work closely with PPA to identify the most likely causes that an accountant would belong to a trained or untrained group and account for them in my analysis. Yet, there is a possibility that other factors were present that I did not identify. Also, treated individuals were not blind to receiving the treatment, which could inflate the findings. However, the inflation would likely apply to all trained individuals, and my findings are based on the moderating effect of prior experience and other individual characteristics. These design limitations are countered by the richness of conducting the study in an organizational context. Still replicating these findings in a full experimental setting would be beneficial.

Finally, I was not able to test the full extent of my theoretical argument because the sample was truncated. I did not have a sufficient number of highly experienced individuals to identify the negative effect of the proposed ceiling constraint. A future study that includes a broader range of experience would be beneficial.

6. BIBLIOGRAPHY

- Ackerman, P. L. (1988). Determinants of individual differences during skill acquisition: Cognitive abilities and information processing. *Journal of Experimental Psychology: General*, *117*(3), 288–318. doi:10.1037/0096-3445.117.3.288
- Adler, P. S., & Clark, K. B. (1991). Behind the learning curve: A sketch of the learning process. *Management Science*, *37*(3), 267–281. doi:10.1287/mnsc.37.3.267
- Aguinis, H., & Kraiger, K. (2009). Benefits of training and development for individuals and teams, organizations, and society. *Annual Review of Psychology*, *60*, 451–74. doi:10.1146/annurev.psych.60.110707.163505
- Angrist, J. D., & Pischke, J.-S. (2009). *Mostly Harmless Econometrics: An empiricist's companion*. Princeton University Press.
- Argote, L. (2013). *Organizational Learning: Creating, Retaining and Transferring Knowledge* (2nd ed.). New York: Springer. doi:10.1007/978-1-4614-5251-5
- Bandura, A. (1977). *Social Learning Theory*. Englewood Cliffs, NJ: Prentice-Hall.
- Bandura, A. (1986). *Social Foundations of Thought and Action: A Social Cognitive Theory*. Upper Saddle River, NJ: Prentice-Hall.
- Bandura, A. (2006). Guide for constructing self-efficacy scales. In F. Pajares & T. Urdan (Eds.), *Self-Efficacy Beliefs of Adolescents* (pp. 307–337). Information Age Publishing.
- Bapna, R., Langer, N., & Mehra, A. (2013). Human Capital Investments and Employee Performance: An Analysis of IT Services Industry. *Management Science*, *59*(3), 641–658.
- Barling, J., Weber, T., & Kelloway, E. K. (1996). Effects of transformational leadership training on attitudinal and financial outcomes: A field experiment. *Journal of Applied Psychology*, *81*(6), 827–832. doi:10.1037//0021-9010.81.6.827
- Bell, B. S., & Kozlowski, S. W. J. (2002). Adaptive Guidance: Enhancing Self-Regulation, Knowledge, and Performance in Technology-Based Training. *Personnel Psychology*, *55*(2), 267–306.
- Blume, B. D., Ford, J. K., Baldwin, T. T., & Huang, J. L. (2010). Transfer of Training: A Meta-Analytic Review. *Journal of Management*, *36*(4), 1065–1105. doi:10.1177/0149206309352880

- Bower, G. H., & Hilgard, E. R. (1981). *Theories of Learning*. Englewood Cliffs, NJ: Prentice-Hall.
- Brett, J. F., & VandeWalle, D. (1999). Goal orientation and goal content as predictors of performance in a training program. *Journal of Applied Psychology, 6*, 863–873. doi:10.1037/0021-9010.84.6.863
- Brown, K. G. (2001). Using computers to deliver training: Which employees learn and why? *Personnel Psychology, 54*(2), 271–296.
- Burke, L. A., & Hutchins, H. M. (2007). Training Transfer: An Integrative Literature Review. *Human Resource Development Review, 6*(3), 263–296. doi:10.1177/1534484307303035
- Burke, M. J., Salvador, R. O., Smith-Crowe, K., Chan-Serafin, S., Smith, A., & Sonesh, S. (2011). The dread factor: how hazards and safety training influence learning and performance. *The Journal of Applied Psychology, 96*(1), 46–70. doi:10.1037/a0021838
- Burnaska, R. (1976). The effects of behavior modeling training upon managers' behaviors and employees' perceptions. *Personnel Psychology, 29*, 329–335. doi:10.1111/j.1744-6570.1976.tb00416.x
- Button, S., Mathieu, J., & Zajac, D. (1996). Goal orientation in organizational research: A conceptual and empirical foundation. *Organizational Behavior and Human Decision Processes, 67*(1), 26–48. doi:10.1006/obhd.1996.0063
- Chan, K.-Y., & Drasgow, F. (2001). Toward a theory of individual differences and leadership: understanding the motivation to lead. *Journal of Applied Psychology, 86*(3), 481–498. doi:10.1037/0021-9010.86.3.481
- Chao, G. T. (1997). Mentoring phases and outcomes. *Journal of Vocational Behavior, 51*(1), 15–28. doi:10.1006/jvbe.1997.1591
- Chi, M. T. H., Feltovich, P. J., & Glaser, R. (1981). Categorization and representation of physics problems by experts and novices. *Cognitive Science, 5*, 121–152. doi:10.1207/s15516709cog0502_2
- Chiaburu, D. S., & Marinova, S. V. (2005). What predicts skill transfer? An exploratory study of goal orientation, training self-efficacy and organizational supports. *International Journal of Training and Development, 9*(2), 110–123. doi:10.1111/j.1468-2419.2005.00225.x
- Cohen, W. M., & Levinthal, D. A. (1990). Absorptive Capacity: A New Perspective on Learning and Innovation. *Administrative Science Quarterly, 35*(1), 128–152.
- Collins, D., & Holton, E. (2004). The effectiveness of managerial leadership development programs: A meta-analysis of studies from 1982 to 2001. *Human Resource Development Quarterly, 15*(2), 217–248. doi:10.1002/hrdq.1099

- Colquitt, J. A., LePine, J. A., & Noe, R. A. (2000). Toward an integrative theory of training motivation: A meta-analytic path analysis of 20 years of research. *Journal of Applied Psychology, 85*(5), 678–707.
- Colquitt, J. A., & Simmering, M. J. (1998). Conscientiousness, goal orientation, and motivation to learn during the learning process: A longitudinal study. *Journal of Applied Psychology, 83*(4), 654–665.
- Coyle, T. R., & Pillow, D. R. (2008). SAT and ACT predict college GPA after removing g. *Intelligence, 36*(6), 719–729. doi:10.1016/j.intell.2008.05.001
- Craig, R. L. (Ed.). (1996). *The ASTD training and development handbook: A guide to human resource development*. New York: McGraw-Hill.
- Cyert, R. M., & March, J. G. (1963). *A Behavioral Theory of the Firm*. Prentice-Hall.
- Darr, E., Argote, L., & Epple, D. (1995). The acquisition, transfer, and depreciation of knowledge in service organizations: Productivity in franchises. *Management Science, 41*(11), 1750–1762. doi:10.1287/mnsc.41.11.1750
- Deci, E. L. (1992). The relation of interest to the motivation of behavior: A self-determination theory perspective. In K. A. Renninger, S. Hidi, & A. Krapp (Eds.), *The Role of Interest in Learning and Development* (pp. 43–70). Hillsdale, NJ: Lawrence Earlbaum Associates.
- Deci, E. L., & Ryan, R. M. (1985). *Intrinsic Motivation and Self-Determination in Human Behavior*. New York: Plenum.
- Deci, E. L., & Ryan, R. M. (1991). A motivational approach to self: Integration in personality. In *Perspectives on Motivation: Nebraska Symposium on Motivation, 1990* (Vol. 38, pp. 237–288). Lincoln, NB: University of Nebraska Press.
- DeRouin, R. E., Fritzsche, B. a., & Salas, E. (2004). Optimizing e-learning: Research-based guidelines for learner-controlled training. *Human Resource Management, 43*(2-3), 147–162. doi:10.1002/hrm.20012
- Dragoni, L., Tesluk, P. E., Russell, J. E. A., & Oh, I.-S. (2009). Understanding managerial development: Integrating developmental assignments, learning orientation, and access to developmental opportunities in predicting. *Academy of Management Journal, 52*(4), 731–743. doi:10.5465/AMJ.2009.43669936
- Dvir, T., Eden, D., Avolio, B., & Shamir, B. (2002). Impact of transformational leadership on follower development and performance: A field experiment. *Academy of Management Journal, 45*(4), 735–744. doi:10.2307/3069307
- Dweck, C. S. (1986). Motivational processes affecting learning. *American Psychologist, 41*(10), 1040–1048.
- Dweck, C. S. (2007). *Mindset: The new psychology of success*. New York: Random House.

- Dweck, C. S., & Leggett, E. L. (1988). A social-cognitive approach to motivation and personality. *Psychological Review*, *95*(2), 256–273. doi:10.1037//0033-295X.95.2.256
- Dyer, J., Gregersen, H., & Christensen, C. M. (2011). *The Innovator's DNA*. Harvard Business Review Press.
- Earley, P. C. (1987). Intercultural training for managers: A comparison of documentary and interpersonal methods. *Academy of Management Journal*, *30*(4), 685–698. doi:10.2307/256155
- Ericsson, K. A., Krampe, R. T., & Tesch-Römer, C. (1993). The role of deliberate practice in the acquisition of expert performance. *Psychological Review*, *100*(3), 363–406. doi:10.1037/0033-295X.100.3.363
- Evans, M. G. (1985). A Monte Carlo study of the effects of correlated method variance in moderated multiple regression analysis. *Organizational Behavior and Human Decision Processes*, *36*(3), 305–323. doi:10.1016/0749-5978(85)90002-0
- Ford, J. K., Quiñones, M. A., Segó, D. J., & Sorra, J. S. (1992). Factors affecting the opportunity to perform trained tasks on the job. *Personnel Psychology*, *45*, 511–528. Retrieved from <http://onlinelibrary.wiley.com/doi/10.1111/j.1744-6570.1992.tb00858.x/full>
- Ford, J. K., Smith, E. M., Weissbein, D. a., Gully, S. M., & Salas, E. (1998). Relationships of goal orientation, metacognitive activity, and practice strategies with learning outcomes and transfer. *Journal of Applied Psychology*, *83*(2), 218–233. doi:10.1037//0021-9010.83.2.218
- Frayne, C. A., & Geringer, J. M. (2000). Self-management training for improving job performance: A field experiment involving salespeople. *Journal of Applied Psychology*, *85*(3), 361–372. doi:10.1037//0021-9010.85.3.361
- Gavetti, G., & Levinthal, D. A. (2000). Looking forward and looking backward: Cognitive and experiential search. *Administrative Science Quarterly*, *45*(1), 113–137. doi:10.2307/2666981
- Gist, M., Stevens, C., & Bavetta, A. (1991). Effects of self-efficacy and post-training intervention on the acquisition and maintenance of complex interpersonal skills. *Personnel Psychology*, *44*, 837–861. doi:10.1111/j.1744-6570.1991.tb00701.x
- Goldberg, L. R. (2014). International Personality Item Pool: A scientific collaboratory for the development of advanced measures of personality traits and other individual differences. Retrieved from www.ipip.org
- Halpin, A. W., & Winer, B. J. (1957). A factorial study of the leader behavior descriptions. In M. Stogdill & A. E. Coons (Eds.), *Leader behavior: Its description and measurement* (pp. 39–51). Columbus, OH: The Ohio State University, Bureau of Business Research.

- Hand, H. H., & Slocum, J. W. (1972). A longitudinal study of the effects of a human relations training program on managerial effectiveness. *Journal of Applied Psychology, 56*(5), 412–417. doi:10.1037/h0033592
- Heslin, P. a., & VandeWalle, D. (2008). Managers' implicit assumptions about personnel. *Current Directions in Psychological Science, 17*(3), 219–223. doi:10.1111/j.1467-8721.2008.00578.x
- Hidi, S. (2000). An interest researcher's perspective: The effects of extrinsic and intrinsic factors on motivation. In C. Sansone & J. Harackiewicz (Eds.), *Intrinsic and Extrinsic Motivation: The Search for Optimal Motivation and Performance* (pp. 311–342). San Diego, CA: Academic Press.
- House, R. J., Hanges, P. J., Javidan, M., Dorfman, P. W., & Gupta, V. (2004). *Culture, leadership, and organizations*. Thousand Oaks, CA: Sage Publications.
- Huber, G. P. (1991). Organizational Learning: The Contributing Processes and the Literatures. *Organization Science, 2*(1), 88–115. doi:10.1287/orsc.2.1.88
- Hughes, M. G., Day, E. A., Wang, X., Schuelke, M. J., Arsenault, M. L., Harkrider, L. N., & Cooper, O. D. (2013). Learner-controlled practice difficulty in the training of a complex task: cognitive and motivational mechanisms. *The Journal of Applied Psychology, 98*(1), 80–98. doi:10.1037/a0029821
- Hunter, J. E. (1986). Cognitive ability, cognitive aptitudes, job knowledge, and job performance. *Journal of Vocational Behavior, 36*(2), 340–362. doi:10.1016/0001-8791(86)90013-8
- Janson, A., & McQueen, R. J. (2007). Capturing leadership tacit knowledge in conversations with leaders. *Leadership & Organization Development Journal, 28*(7), 646–663. doi:10.1108/01437730710823897
- Janssen, O., & Van Yperen, N. W. (2004). Employees' Goal Orientations, the Quality of Leader-Member Exchange, and the Outcomes of Job Performance and Job Satisfaction. *Academy of Management Journal, 47*(3), 368–384. doi:10.2307/20159587
- Jentsch, F., Bowers, C., & Salas, E. (2001). What Determines Whether Observers Recognize Targeted Behaviors in Modeling Displays? *Human Factors, 43*(3), 496–507. doi:10.1518/001872001775898278
- Johnson, J. A. (2005). Ascertaining the validity of individual protocols from Web-based personality inventories. *Journal of Research in Personality, 39*(February), 103–129. doi:10.1016/j.jrp.2004.09.009
- Judge, T. A., Colbert, A. E., & Ilies, R. (2004). Intelligence and leadership: A quantitative review and test of theoretical propositions. *Journal of Applied Psychology, 89*(3), 542–552. doi:10.1037/0021-9010.89.3.542

- Judge, T. A., Jackson, C. L., Shaw, J. C., Scott, B. A., & Rich, B. L. (2007). Self-efficacy and work-related performance: the integral role of individual differences. *Journal of Applied Psychology, 92*(1), 107–27. doi:10.1037/0021-9010.92.1.107
- Just, M., & Carpenter, P. (1992). A capacity theory of comprehension: Individual differences in working memory. *Psychological Review, 99*(1), 122–149. doi:10.1037/0033-295X.99.1.122
- Kanfer, R. (1990). Motivation Theory and Industrial and Organizational Psychology. In M. D. Dunnette & L. M. Hough (Eds.), *Handbook of industrial and organizational psychology* (Vol. 1, pp. 75–170). Palo Alto, CA: Consulting Psychologists Press.
- Kanfer, R., & Ackerman, P. L. (1989). Motivation and cognitive abilities: An integrative/aptitude-treatment interaction approach to skill acquisition. *Journal of Applied Psychology, 74*(4), 657–690. doi:10.1037//0021-9010.74.4.657
- Kickul, J., & Neuman, G. (2000). Emergent leadership behaviors: The function of personality and cognitive ability in determining teamwork performance and KSAs. *Journal of Business and Psychology, 15*(1), 27–51. doi:10.1023/A:1007714801558
- Klein, H. J., Noe, R. a., & Wang, C. (2006). Motivation To Learn and Course Outcomes: the Impact of Delivery Mode, Learning Goal Orientation, and Perceived Barriers and Enablers. *Personnel Psychology, 59*(3), 665–702. doi:10.1111/j.1744-6570.2006.00050.x
- Knowles, M. S. (1996). Adult learning. In R. L. Craig (Ed.), *The ASTD training and development handbook: A guide to human resource development* (pp. 253–265). New York: McGraw-Hill.
- Koenig, K. A., Frey, M. C., & Detterman, D. K. (2008). ACT and general cognitive ability. *Intelligence, 36*(2), 153–160. doi:10.1016/j.intell.2007.03.005
- Kolb, D. A. (2014). *Experiential learning: Experience as the source of learning and development* (2nd ed.). FT Press.
- Kraiger, K., Ford, J., & Salas, E. (1993). Application of cognitive, skill-based, and affective theories of learning outcomes to new methods of training evaluation. *Journal of Applied Psychology, 78*(2), 311–328. doi:10.1037//0021-9010.78.2.311
- Kram, K. E., & Isabella, L. A. (1985). Mentoring Alternatives: the Role of Peer Relationships in Career Development. *Academy of Management Journal, 28*(1), 110–132. doi:10.2307/256064
- Kyllonen, P., & Woltz, D. (1989). Role of cognitive factors in the acquisition of cognitive skill. In R. Kanfer, P. L. Ackerman, & R. Cudeck (Eds.), *Abilities, Motivation, and Methodology: The Minnesota Symposium on Learning and Individual Differences*. Hillsdale, NJ: Lawrence Earlbaum Associates.

- Latham, G. P., & Saari, L. M. (1979). Application of social-learning theory to training supervisors through behavioral modeling. *Journal of Applied Psychology, 64*(3), 239–246. doi:10.1037//0021-9010.64.3.239
- Lave, J., & Wenger, E. (1991). *Situated Learning: Legitimate Peripheral Participation*. New York: Cambridge University Press.
- Levitt, B., & March, J. G. (1988). Organizational learning. *Annual Review of Sociology, 14*, 319–340. doi:10.1146/annurev.so.14.080188.001535
- Lim, B.-C. (2006). Assessing the convergent and discriminant validity of Goldberg's International Personality Item Pool: A multitrait-multimethod examination. *Organizational Research Methods, 9*(1), 29–54. doi:10.1177/1094428105283193
- Lim, D. H., & Johnson, S. D. (2002). Trainee perceptions of factors that influence learning transfer. *International Journal of Training and Development, 6*(1), 36–48. doi:10.1111/1468-2419.00148
- Lindsay, P. H., & Norman, D. A. (1977). *Human Information Processing*. Orlando, FL: Academic Press.
- Mathieu, J., & Leonard, R. (1987). Applying utility concepts to a training program in supervisory skills: A time-based approach. *Academy of Management Journal, 30*(2), 316–335. doi:10.2307/256277
- McNeese-Smith, D. K. (1999). The relationship between managerial motivation, leadership, nurse outcomes and patient satisfaction. *Journal of Organizational Behavior, 20*(2), 243–259. doi:10.1002/(SICI)1099-1379(199903)20:2<243::AID-JOB888>3.0.CO;2-2
- Meade, A. W., & Craig, S. B. (2012). Identifying careless responses in survey data. *Psychological Methods, 17*, 437–455. doi:10.1037/a0028085
- Miner, A. S., Bassoff, P., & Moorman, C. (2001). Organizational and Improvisation Learning : A Field Study. *Administrative Science Quarterly, 46*(2), 304–337. doi:10.2307/2667089
- Morrow, C., Jarrett, M., & Rupinski, M. (1997). An investigation of the effect and economic utility of corporate-wide training. *Personnel Psychology, 50*, 91–119. doi:10.1111/j.1744-6570.1997.tb00902.x
- Nickerson, J., & Zenger, T. (2004). A knowledge-based theory of the firm—The problem-solving perspective. *Organization Science, 15*(6), 617–632. doi:10.1287/orsc.1040.0093
- Noe, R. A., & Schmitt, N. (1986). The Influence of Trainee Attitudes on Training Effectiveness: Test of a Model. *Personnel Psychology, 39*(3), 497–523. doi:10.1111/j.1744-6570.1986.tb00950.x

- Paas, F., Renkl, A., & Sweller, J. (2003). Cognitive Load Theory and Instructional Design: Recent Developments. *Educational Psychologist, 38*(1), 1–4. doi:10.1207/S15326985EP3801_1
- Paas, F., & Van Merriënboer, J. J. G. (1994). Variability of worked examples and transfer of geometrical problem-solving skills: A cognitive-load approach. *Journal of Educational Psychology, 86*(1), 122–133. doi:10.1037/0022-0663.86.1.122
- Payne, S. C., Youngcourt, S. S., & Beaubien, J. M. (2007). A meta-analytic examination of the goal orientation nomological net. *The Journal of Applied Psychology, 92*(1), 128–50. doi:10.1037/0021-9010.92.1.128
- Podsakoff, P. M., MacKenzie, S. B., Lee, J.-Y., & Podsakoff, N. P. (2003). Common method biases in behavioral research: a critical review of the literature and recommended remedies. *Journal of Applied Psychology, 88*(5), 879–903. doi:10.1037/0021-9010.88.5.879
- Ree, M., & Earles, J. (1991). Predicting training success: Not much more than g. *Personnel Psychology, 44*, 321–332. doi:10.1111/j.1744-6570.1991.tb00961.x
- Ryan, R. M., & Deci, E. L. (2000). Self-determination theory and the facilitation of intrinsic motivation, social development, and well-being. *The American Psychologist, 55*(1), 68–78. doi:10.1037/0003-066X.55.1.68
- Salas, E., & Cannon-bowers, J. A. (2001). The science of training: A decade of progress. *Annual Review of Psychology, 60*, 451–474. doi:10.1146/annurev.psych.52.1.471
- Schilling, M. A., Vidal, P., Ployhart, R. E., & Marangoni, A. (2003). Learning by doing something else: Variation, relatedness, and the learning curve. *Management Science, 49*(1), 39–56. doi:10.1287/mnsc.49.1.39.12750
- Schmidt, A. M., & Ford, J. K. (2003). Learning within a learner control training environment: The interactive effects of goal orientation and metacognitive instruction on learning outcomes. *Personnel Psychology, 56*(2), 405–429. doi:10.1111/j.1744-6570.2003.tb00156.x
- Schnotz, W., & Kürschner, C. (2007). A Reconsideration of Cognitive Load Theory. *Educational Psychology Review, 19*(4), 469–508. doi:10.1007/s10648-007-9053-4
- Shadish, W. R., Cook, T. D., & Campbell, D. T. (2002). *Experimental and Quasi-Experimental Designs for Generalized Causal Inference*. Belmont, CA: Wadsworth Cengage Learning.
- Siemsen, E., Roth, A., & Oliveira, P. (2010). Common Method Bias in Regression Models With Linear, Quadratic, and Interaction Effects. *Organizational Research Methods, 13*(3), 456–476. doi:10.1177/1094428109351241
- Sleight, D. A. (1993). A Developmental History of Training in the United States and Europe. Retrieved from <https://www.msu.edu/~sleightd/trainhst.html>

- Sorcher, M., & Spence, R. (1982). The Interface Project: Behavior Modeling As Social Technology in South Africa. *Personnel Psychology*, 35(3), 557–581. doi:10.1111/j.1744-6570.1982.tb02210.x
- Stajkovic, A. D., & Luthans, F. (1998). Self-efficacy and work-related performance: A meta-analysis. *Psychological Bulletin*, 124(2), 240–261. doi:10.1037//0033-2909.124.2.240
- Sweller, J. (1988). Cognitive load during problem solving: Effects on learning. *Cognitive Science*, 12(2), 257–285. doi:10.1016/0364-0213(88)90023-7
- Sweller, J. (2011). Cognitive Load Theory. In J. P. Mestre & B. H. Ross (Eds.), *The Psychology of learning and Motivation: Cognition in Education* (Vol. 55). Academic Press.
- Taylor, P. J. (1998). A new integrated framework for training needs analysis. *Human Resource Management Journal*, 8(2), 29–50. doi:10.1111/j.1748-8583.1998.tb00165.x
- Taylor, P. J., Russ-Eft, D. F., & Chan, D. W. L. (2005). A meta-analytic review of behavior modeling training. *The Journal of Applied Psychology*, 90(4), 692–709. doi:10.1037/0021-9010.90.4.692
- Taylor, P. J., Russ-Eft, D. F., & Taylor, H. (2009). Transfer of management training from alternative perspectives. *The Journal of Applied Psychology*, 94(1), 104–21. doi:10.1037/a0013006
- Tews, M., & Tracey, J. (2008). An empirical examination of posttraining on-the-job supplements for enhancing the effectiveness of interpersonal skills training. *Personnel Psychology*, 61, 375–401. doi:10.1111/j.1744-6570.2008.00117.x
- Tracey, J. B., Hinkin, T. R., Tannenbaum, S., & Mathieu, J. E. (2001). The influence of individual characteristics and the work environment on varying levels of training outcomes. *Human Resource Development Quarterly*, 12(1), 5–23. doi:10.1002/1532-1096(200101/02)12:1<5::AID-HRDQ>3.0.CO;2-J
- Tuovinen, J. E., & Sweller, J. (1999). A comparison of cognitive load associated with discovery learning and worked examples. *Journal of Educational Psychology*, 91(2), 334–341. doi:10.1037//0022-0663.91.2.334
- Van Gog, T., & Rummel, N. (2010). Example-Based Learning: Integrating Cognitive and Social-Cognitive Research Perspectives. *Educational Psychology Review*, 22(2), 155–174. doi:10.1007/s10648-010-9134-7
- Van Merriënboer, J. J. G., & Sweller, J. (2005). *Cognitive Load Theory and Complex Learning: Recent Developments and Future Directions*. *Educational Psychology Review* (Vol. 17). doi:10.1007/s10648-005-3951-0
- VandeWalle, D., Brown, S. P., Cron, W. L., & Slocum, J. W. . J. (1999). The influence of goal orientation and self-regulation tactics on sales performance: A longitudinal field test. *Journal of Applied Psychology*, 84(2), 249–259. doi:10.1037//0021-9010.84.2.249

- Vroom, V. H. (1964). *Work and Motivation*. New York: Wiley.
- Wexley, K. N., & Nemeroff, W. F. (1975). Effectiveness of positive reinforcement and goal setting as methods of management development. *Journal of Applied Psychology, 60*(4), 446–450. doi:10.1037/h0076912
- Yarnall, J. (1998). Line managers as career developers: rhetoric or reality? *Personnel Review, 27*(5), 378–395. doi:10.1108/00483489810230325
- Yukl, G., Gordon, A., & Taber, T. (2002). A hierarchical taxonomy of leadership behavior: Integrating a half century of behavior research. *Journal of Leadership & Organizational Studies, 9*(1), 15–32.

7. APPENDIX A: SURVEY ITEMS

Items may belong to one of three different surveys: (1) senior associate survey, (2) subordinate survey, or (3) manager survey. Senior associates are the primary subjects under investigation. Subordinates and managers provide information about the senior associates. Some items will only be asked in the Time 1 survey. Others will be asked in the Time 1, 2, & 3 surveys. Some items are crossed out because pretesting showed that they do not load well with the other items.

Big Five: Agreeableness (AGREE)

International Personality Item Pool 10-item measure for agreeableness (Goldberg, 2014). The IPIP appears to replicate NEO-FFI well (B.-C. Lim, 2006).

Survey: Subordinate, Time 1

Prompt: Describe yourself as you generally are now, not as you wish to be in the future. Describe yourself as you honestly see yourself. Indicate the accuracy of each of the following statements.

Scale: 1 = Very inaccurate, 2 = Moderately inaccurate, 3 = Neither accurate nor inaccurate, 4 = Moderately accurate, or 5 = Very accurate.

AGREE.01	Am interested in people.
AGREE.02	Am not really interested in others. (R)
AGREE.03	Sympathize with others' feelings.
AGREE.04	Am not interested in other people's problems. (R)
AGREE.05	Take time out for others.
AGREE.06	Feel little concern for others. (R)
AGREE.07	Feel others' emotions.
AGREE.08	Make people feel at ease.

Big Five: Conscientiousness (CONSC)

International Personality Item Pool 10-item measure for conscientiousness (Goldberg, 2014). CONSC.09 is substituted in from the 20-item measure.

Survey: Senior Associate, Time 1

Prompt: See Big Five: Agreeableness

Scale: See Big Five: Agreeableness

CONSC.01	Am always prepared.
CONSC.04	Pay attention to details.
CONSC.07	Waste my time. (R)
CONSC.09	Finish what I start. [Replaces "Get chores done right away"]
CONSC.10	Shirk my duties. (R)

CONSC.13	Carry out my plans.
CONSC.15	Find it difficult to get down to work. (R)
CONSC.18	Do just enough work to get by. (R)
CONSC.21	Make plans and stick to them.
CONSC.24	Don't see things through. (R)

Big Five: Extraversion (EXTRA)

International Personality Item Pool 10-item measure that mimics the NEO extraversion domain (Goldberg, 2014).

Survey: Senior Associate, Time 1

Prompt: See Big Five: Agreeableness.

Scale: See Big Five: Agreeableness.

EXTRA.03	Feel comfortable around people.
EXTRA.06	Have little to say. (R)
EXTRA.12	Don't like to draw attention to myself. (R)
EXTRA.14	Am skilled in handling social situations.
EXTRA.17	Keep in the background. (R)
EXTRA.20	Am the life of the party.
EXTRA.23	Don't talk a lot. (R)
EXTRA.26	Know how to captivate people.

Big Five: Openness to Experience (OPNEX)

International Personality Item Pool 10-item measure that mimics the NEO openness to experience domain (Goldberg, 2014).

Survey: Senior Associate, Time 1

Prompt: See Big Five: Agreeableness.

Scale: See Big Five: Agreeableness.

OPNEX.02	Believe in the importance of art.
OPNEX.05	Avoid philosophical discussions. (R)
OPNEX.08	Am not interested in abstract ideas. (R)
OPNEX.11	Have a vivid imagination.
OPNEX.16	Carry the conversation to a higher level.
OPNEX.19	Enjoy hearing new ideas.
OPNEX.22	Do not like art. (R)
OPNEX.25	Am not interested in theoretical discussions. (R)

Experience 1 (EXPR1)

Tax, audit, and leadership experience. New measure.

Survey: Senior Associate, Time 1

Prompt: Please share information about your tax and audit experience.

Scale: Numeric

- EXPR1A.01 Since joining CLA, what percentage of your work has been audit/assurance work?
- EXPR1A.02 Since joining CLA, what percentage of your work has been tax work?
- EXPR1A.03 Since joining CLA, what percentage of your work has been work in other areas?
- EXPR1B.01 Over the last year, how many audit projects have you led as the *in charge*?
- EXPR1B.02 Over the last year, how many tax projects have you led as the *in charge*?
- EXPR1C.01 How many months of experience do you have *leading* audit projects?
- EXPR1C.02 How many months experience do you have *leading* tax projects?
- EXPR1D.01 How many months of experience do you have leading others in organizations other than CLA?
- EXPR1D.02 About how many people do/did you manage in the other organization?

Experience 2 (EXPR2)

Incidents of leadership exposure; both breadth and depth. New measure.

Survey: Senior Associate, Time 1

Prompt: Below are some situations leaders may face as they manage the staff on their teams.

Please mark all the situations you have experienced as a leader, either as a project leader in CLA or as a leader outside of CLA.

Scale: Checkbox: Experienced within CLA; Experienced outside of CLA

- EXPR2A.01 Dealt with staff lacking interpersonal skills.
- EXPR2A.02 Managed staff lacking requisite job skills.
- EXPR2A.03 Managed unmotivated staff .
- EXPR2A.04 Managed conflict between staff .
- EXPR2A.05 Dealt with a staff member's major mistake.
- EXPR2A.06 Provided feedback to staff with poor performance.
- EXPR2A.07 Worked on a development plan with a staff member.
- EXPR2A.08 Helped a staff member gain an important new experience.
- EXPR2A.09 Taught a staff member a new skill.

Prompt: You marked that you have experienced each of the following scenarios. What amount of experience do you have with each?

Scale: 1 = Very little, 2 = Little, 3 = Moderate, 4 = Great, 5 = Very great

- EXPR2B.01 Dealt with staff lacking interpersonal skills.
- EXPR2B.02 Managed staff lacking requisite job skills.
- EXPR2B.03 Managed unmotivated staff .
- EXPR2B.04 Managed conflict between staff .
- EXPR2B.05 Dealt with a staff member's major mistake.
- EXPR2B.06 Provided feedback to staff with poor performance.
- EXPR2B.07 Worked on a development plan with a staff member.
- EXPR2B.08 Helped a staff member gain an important new experience.
- EXPR2B.09 Taught a staff member a new skill.

Cognitive Ability (COGAB)

General cognitive ability, as measured by SAT or ACT score.

Survey: Senior Associate, Time 1

Prompt: What was your SAT or ACT score? If you do not remember, please make your best estimate.

Scale: Numeric

COGAB.SAT SAT score (out of 2400).

COGAB.ACT ACT score (out of 36).

Learning Goal Orientation (GOLRN)

Measures of performance goal orientation and learning goal orientation are taken directly from Button, Mathieu, and Zajac (1996).

Survey: Senior Associate, Time 1

Prompt: Please indicate the how much you agree that the following statements describe you.

Scale: 1 = Strongly disagree, 4 = Neither agree nor disagree, 7 = Strongly Agree.

GOLRN.01 The opportunity to do challenging work is important to me.

GOLRN.02 When I fail to complete a difficult task, I plan to try harder the next time I work on it.

GOLRN.03 I prefer to work on tasks that force me to learn new things.

GOLRN.04 The opportunity to learn new things is important to me.

GOLRN.05 I do my best when I'm working on a fairly difficult task.

GOLRN.06 I try hard to improve on my past performance.

GOLRN.07 The opportunity to extend the range of my abilities is important to me.

GOLRN.08 When I have difficulty solving a problem, I enjoy trying different approaches to see which one will work.

Leadership Behaviors: Manager Rating

Measure the leadership performance based on supervisor perception.

Survey: Manager (Coach)

Prompt: Think about the leadership demonstrated by [project lead] over the last three months (over the summer). First, think back *before* the summer: to what extent did [project lead] do the following things? Second, to what extent has [project lead] improved or declined in these areas since before the summer?

Scale 1: 1 = None, 2 = Small extent, 3 = Moderate extent, 4 = Great extent, 5 = Very great extent, 6 = Don't know [PST scale]

Scale 2: 1 = Declined greatly, 2 = Declined moderately, 3 = Declined slightly, 4 = About the same, 5 = Improved slightly, 6 = Improved moderately, 7 = Improved greatly, 8 = Don't know [CHG scale]

- [PST/CHG]COB Clarifying roles: Assign specific tasks, explain job responsibilities, and clearly communicate objectives, deadlines and performance expectations.
- [PST/CHG]MOP Monitoring operations: Request updates and thoroughly review tasks, monitor progress toward deadlines, and evaluate performance of project staff.
- [PST/CHG]STP Short-term planning: Create detailed schedules, plans, and contingencies to use people and resources efficiently.
- [PST/CHG]SUP Supporting: Act considerately, show sympathy and support, and provide encouragement to project staff.
- [PST/CHG]EPW Empowering: Allow staff discretion in their work, trust staff to solve problems on their own, and allow others to make decisions without prior approval.
- [PST/CHG]RCG Recognizing: Provide praise for good performance and recognize staff for special contributions or significant achievements.
- [PST/CHG]DVL Developing: Provide coaching and new opportunities or challenging assignments to help project staff develop.
- [PST/CHG]CRC Correcting: Provide helpful directions and constructive feedback for correcting mistakes; use an appropriate tone when giving feedback.

Coach Confidence

Measure of coach's confidence in responses.

Survey: Manager (Coach)

Prompt: To what extent have you observed (directly or indirectly) the performance of [project lead]?

Scale 1: 1 = None, 2 = Small extent, 3 = Moderate extent, 4 = Great extent, 5 = Very great extent

Prompt: How confident are you in your evaluation of [project lead]?

Scale 1: 1 = Not confident at all, 2, 3 = Somewhat confident, 4, 5 = Very confident

Leadership Behaviors: Self-Rating

New scale items based on eight leadership behavior categories developed by Yukl, Gordon, and Taber (2002).

Survey: Senior Associate Survey, Time 1, 2, & 3

Prompt: The following actions relate to leading tax and audit projects. Think about your actions in your leadership roles over the *last five weeks*. To what extent did you do following things?

Scale: 1 = None, 2 = Little, 3 = Some, 4 = A lot, 5 = Great extent, 6 = Not applicable

See Leadership Behaviors: Subordinate Rating for items.

Leadership Behaviors: Subordinate Rating

Survey: Subordinate Survey, Time 1, 2, & 3.

Prompt: The following actions relate to leading tax and audit projects. Think about the actions of [project lead] over the *last five weeks*. Based on your observations, to what extent does [project lead] do the following things?

Scale: 1 = None, 2 = Small extent, 3 = Moderate extent, 4 = Great extent, 5 = Very great extent, 6 = Not applicable

Clarifying Roles

- LBCOB.01 Assign specific tasks to specific individuals.
- LBCOB.02 Explain job responsibilities
- LBCOB.03 Communicate a clear understanding of objectives.
- LBCOB.04 Clearly communicate deadlines and performance expectations.

Monitoring Operations

- LBMOP.01 Request updates on the status of tasks
- LBMOP.02 Thoroughly review the quality of completed tasks
- LBMOP.03 Monitor progress toward hitting deadlines
- LBMOP.04 Evaluate the performance of team members

Short-term Planning

- LBSTP.01 Identify the right people needed for projects
- LBSTP.02 Create a detailed schedule for project tasks
- LBSTP.03 Create plans to use people and resources efficiently
- LBSTP.04 Plan contingencies ahead of time for possible problems

Supporting

- LBSUP.01 Act considerately toward others
- LBSUP.02 Show sympathy or support when someone is upset or anxious
- LBSUP.03 Provide encouragement in difficult or stressful tasks
- LBSUP.04 Show patience towards others

Empowering

- LBEPW.01 Allow others discretion in their work activities
- LBEPW.02 Trust people to solve problems on their own
- LBEPW.03 Allow others to make decisions without asking for approval
- LBEPW.04 Give others substantial responsibility over their work

Recognizing

- LBRCG.01 Provide praise for good performance
- LBRCG.02 Recognize others for significant achievements
- LBRCG.03 Show gratitude for special contributions
- LBRCG.04 Point out performance improvements

Developing

- LBDVL.01 Provide coaching on difficult or new tasks
- LBDVL.02 Provide opportunities and work assignments to develop skills
- LBDVL.03 Instruct staff to help them learn to improve their skills
- LBDVL.04 Give new or more challenging assignments to help staff grow

Correcting

- LBCRC.01 Provide helpful directions for correcting mistakes
- LBCRC.02 Avoid blaming when staff make errors
- LBCRC.03 Offer constructive feedback for improvement

LBCRC.04 Use a positive tone when giving correction

Learning (LEARN)

Main take-aways of training participant.

Survey: Post training feedback

Scale: Free text.

LEARN.01 What are the main points that you learned from the training?

LEARN.02 What do you expect to do differently when you return to work?

Motivation to Lead

Subset of 13 items from Chan and Drasgo's (2001) motivation to lead scale. I do not use the social-normative motivation to lead dimension. Changed instances of "group" to "team." Added "career" MTLCA.02. Changed MTLCA.04 from "rewards" to "recognition." Changed MTLCA.06 from "more privileges" to "career rewards."

Survey: Senior Associate, Time 1

Prompt: Please indicate how much you agree or disagree with the following statements.

Scale: 1=Strongly disagree, 4=Neither agree or disagree, 7=Strongly agree.

Affective Motivation to Lead (MTLAF)

MTLAF.01 Most of the time, I prefer being a leader rather than a follower when working in a team.

MTLAF.03 I am the type of person who is not interested in leading others. (R)

MTLAF.05 I am definitely not a leader by nature. (R)

MTLAF.07 I am the type of person who likes to be in charge of others.

MTLAF.09 I usually want to be the leader in the teams that I work in.

Calculative Motivation to Lead (MTLCA)

MTLCA.02 I will never agree to lead if I cannot see any career benefits from accepting that role.

MTLCA.04 I am interested in leading a team if there are clear advantages for me.

MTLCA.06 I would only agree to be a team leader if I know I can benefit from that role.

MTLCA.08 I would agree to lead others even if there is no special recognition with that role. (R)

MTLCA.10 I would want to know "what's in it for me" if I am going to agree to lead a team.

Opportunity to Lead (LDOPP)

Opportunity to use leadership behaviors. New measure.

Survey: Senior Associate Survey, Time 1, 2, & 3

Prompt: In the past 5 weeks, what percentage of your work...

Scale: Numeric

- LDOPPA.01 Has been spent directly training others or providing feedback on their work?
 LDOPPA.02 Has required you to assume other leadership responsibilities?

Survey: Senior Associate Survey, Time 1

Prompt: Over the next three months, what percentage of your work will...

Scale: Numeric

- LDOPPB.01 Be spent directly training others or providing feedback on their work?
 LDOPPB.02 Require you to assume other leadership responsibilities?

Self-Efficacy (EFFIC)

New measure specific to project leads for tax and audit projects. Developed following Bandura's (2006) guide for constructing context-specific self-efficacy measures. Self-efficacy is specific helping others develop their skills.

Survey: Project lead survey, 1, 2, & 3; Post training feedback

Prompt: The following questions are designed to help us gain a better understanding of the kinds of things that that make it difficult to mentor project staff. Please rate how certain you are that you can do the things mentioned below. Rate your degree of confidence by entering a number from 0 to 10.

Scale: 0 = Cannot do at all, 5 = Moderately can do, 10 = Highly certain can do.

- EFFIC.01 Help newly hired staff quickly become productive.
 EFFIC.02 Recognize when staff need additional mentoring.
 EFFIC.03 Create the right environment for staff to learn in.
 EFFIC.04 Provide feedback that motivates improvement.
 EFFIC.05 Match staff to the right tasks for their development.
 EFFIC.06 Balance the need to train staff on the job and to meet deadlines.
 EFFIC.07 Provide the correct level of detail in feedback.
 EFFIC.08 Teach staff who make mistakes.
 EFFIC.09 Recognize the best times to provide advice.
 EFFIC.10 Provide meaningful praise and positive reinforcement.

Relationship Length (RELLN)

Length of relationship with senior associate.

Survey: Subordinate, Time 1 (and potentially 2 & 3)

Prompt: About how many months have you worked with [project lead]?

Scale: Numeric

Supervisory Support (SUSUP)

Five items measuring management support for development by Yarnall (1998). Item 6 and 7 are new items added to the scale.

Survey: Senior Associate, Time 1

Prompt: For each of the following statements concerning your manager, please indicate your level of agreement or disagreement.

Scale: 1=Strong disagree, 4=Neither agree or disagree, 7=Strongly agree.

- SUSUP.01 My manager shows me how to improve my performance
- SUSUP.02 My manager utilizes a variety of methods to assist me with my development
- SUSUP.03 My manager has the skills to coach me effectively in my development
- SUSUP.04 My manager views developing associates as an important aspect of his/her job
- SUSUP.05 My manager helps me select training best suited for my development
- SUSUP.06 My manager encourages me to apply training I receive

Weekly Work Hours (WKHRS)

Average number of hours worked per week over the last four weeks.

Survey: Senior Associate, Time 1-3; Subordinate, Time 1-3

Prompt: Think back over your last four weeks of work. On average, how many hours have you worked per week?

Scale: Numeric

8. APPENDIX B: LARGE TABLES

Table 19. CFA for time-varying constructs (measured at multiple time periods).

Construct / Item	Est.	S.E.	z-value	Coef. α
<i>Clarifying roles</i>				0.89
Assign specific tasks to specific individuals.	0.78	0.05	15.39	
Explain job responsibilities.	0.79	0.05	17.15	
Communicate a clear understanding of objectives.	0.76	0.04	17.82	
Clearly communicate deadlines and performance expectations.	0.78	0.05	16.45	
<i>Developing</i>				0.91
Provide coaching on difficult or new tasks.	0.84	0.05	16.41	
Provide opportunities and work assignments to develop skills.	0.88	0.05	18.37	
Instruct staff to help them learn to improve their skills.	0.85	0.04	19.21	
Give new or more challenging assignments to help staff grow.	0.84	0.05	16.36	
<i>Recognizing</i>				0.89
Provide praise for good performance.	0.86	0.04	19.92	
Recognize others for significant achievements.	0.81	0.05	17.31	
Show gratitude for special contributions.	0.80	0.04	18.00	
Point out performance improvements.	0.80	0.05	15.37	
<i>Correcting</i>				0.86
Provide helpful directions for correcting mistakes.	0.71	0.04	16.17	
Avoid blaming when staff make errors.	0.66	0.06	12.06	
Offer constructive feedback for improvement.	0.73	0.04	16.92	
Use a positive tone when giving correction.	0.65	0.05	13.95	
<i>Supporting</i>				0.87
Act considerately toward others.	0.62	0.05	12.99	
Show sympathy or support when someone is upset or anxious.	0.76	0.06	13.25	
Provide encouragement in difficult or stressful tasks.	0.72	0.05	14.49	
Show patience towards others.	0.61	0.05	12.28	
<i>Empowering</i>				0.89
Allow others discretion in their work activities.	0.69	0.04	15.51	
Trust people to solve problems on their own.	0.71	0.04	17.33	
Allow others to make decisions without asking for approval.	0.73	0.05	15.56	
Give others substantial responsibility over their work.	0.76	0.04	17.51	
<i>Monitoring operations</i>				0.85
Request updates on the status of tasks.	0.84	0.05	16.77	
Thoroughly review the quality of completed tasks.	0.77	0.06	12.79	
Monitor progress toward hitting deadlines.	0.80	0.05	17.15	
Evaluate the performance of team members.	0.68	0.05	13.13	
<i>Short-term planning</i>				0.87
Identify the right people needed for projects.	0.81	0.05	15.93	
Create a detailed schedule for project tasks.	0.72	0.06	12.79	
Create plans to use people and resources efficiently.	0.83	0.05	16.65	
Plan contingencies ahead of time for possible problems.	0.70	0.05	13.59	
<i>Self-efficacy</i>				0.93
Help newly hired staff quickly become productive.	1.36	0.10	14.28	

Construct / Item	Est.	S.E.	z-value	Coef. α				
Recognize when staff need additional mentoring.	1.27	0.08	15.15					
Create the right environment for staff to learn in.	1.21	0.09	13.19					
Provide feedback that motivates improvement.	1.33	0.09	15.14					
Match staff to the right tasks for their development.	1.35	0.10	14.20					
Balance the need to train staff on the job and to meet deadlines.	1.32	0.10	13.01					
Provide the correct level of detail in feedback.	1.35	0.10	14.20					
Teach staff who make mistakes.	1.34	0.08	15.78					
Recognize the best times to provide advice.	1.34	0.10	13.77					
Provide meaningful praise and positive reinforcement.	1.40	0.10	14.20					
Observations = 285; $\chi^2 = 1323.2$, d.f. = 765, p-value < .001								
CFI = 0.94, NNFI = 0.93, RMSEA = 0.051 (0.046 - 0.055)								
Construct Correlations	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
(1) Clarifying roles								
(2) Developing	0.87							
(3) Recognizing	0.57	0.58						
(4) Correcting	0.62	0.64	0.78					
(5) Supporting	0.40	0.42	0.53	0.63				
(6) Empowering	0.59	0.54	0.51	0.63	0.44			
(7) Monitoring operations	0.75	0.70	0.73	0.78	0.45	0.59		
(8) Short-term planning	0.66	0.70	0.61	0.64	0.40	0.68	0.73	
(9) Self-efficacy	0.27	0.30	0.34	0.44	0.38	0.27	0.38	0.40

Table 20. CFA for time-invariant constructs (measured only once).

Construct / Item	Est.	S.E.	z-value	Coef. α
Conscientiousness				0.84
Am always prepared.	0.45	0.06	7.83	
Pay attention to details.	0.45	0.07	6.71	
Waste my time. (R)	0.49	0.08	6.26	
Finish what I start.	0.48	0.05	9.69	
Carry out my plans.	0.46	0.05	9.72	
Make plans and stick to them.	0.55	0.05	10.21	
Don't see things through. (R)	0.48	0.05	9.17	
Extraversion				0.83
Feel comfortable around people.	0.39	0.06	6.12	
Have little to say. (R)	0.55	0.08	7.24	
Don't like to draw attention to myself. (R)	0.68	0.08	8.39	
Am skilled in handling social situations.	0.55	0.07	8.23	
Keep in the background. (R)	0.71	0.07	10.02	
Am the life of the party.	0.65	0.08	8.43	
Don't talk a lot. (R)	0.75	0.08	9.51	
Openness to experience				0.73
Believe in the importance of art.	0.72	0.11	6.86	
Am not interested in abstract ideas. (R)	0.61	0.08	7.77	
Have a vivid imagination.	0.59	0.09	6.40	
Do not like art. (R)	0.60	0.10	5.70	
Am not interested in theoretical discussions. (R)	0.48	0.09	5.46	
Supervisory support				0.93

Construct / Item	Est.	S.E.	z-value	Coef. α
My manager shows me how to improve my performance	1.26	0.08	14.96	
My manager utilizes a variety of methods to assist my development	1.34	0.09	14.64	
My manager has the skills to coach me effectively in my development	1.03	0.09	11.67	
My manager views developing staff as an important aspect of his/her job	1.01	0.09	10.80	
My manager helps me select training best suited for my development	1.22	0.11	11.28	
My manager encourages me to apply training I receive	0.95	0.10	9.56	
Affective motivation to lead				0.73
Most of the time, I prefer being a leader rather than a follower when working in a team.	0.74	0.09	8.13	
I am the type of person who is not interested in leading others. (R)	0.54	0.11	4.95	
I am definitely not a leader by nature. (R)	0.90	0.10	8.55	
I am the type of person who likes to be in charge of others.	0.63	0.11	5.72	
I usually want to be the leader in the teams that I work in.	0.71	0.09	7.69	
Calculative motivation to lead				0.77
I will never agree to lead if I cannot see any career benefits from accepting that role.	0.77	0.11	6.88	
I would only agree to be a team leader if I know I can benefit from that role.	1.35	0.11	12.27	
I would agree to lead others even if there is no special recognition. (R)	0.53	0.08	6.21	
I would want to know "what's in it for me" if I am going to lead a team.	0.83	0.12	7.17	
Learning goal orientation				0.90
The opportunity to do challenging work is important to me.	0.75	0.06	12.52	
When I fail to complete a difficult task, I plan to try harder the next time I work on it.	0.61	0.06	10.26	
I prefer to work on tasks that force me to learn new things.	0.75	0.07	10.84	
The opportunity to learn new things is important to me.	0.70	0.05	12.94	
I do my best when I'm working on a fairly difficult task.	0.80	0.09	8.84	
I try hard to improve on my past performance.	0.54	0.07	7.99	
The opportunity to extend the range of my abilities is important to me.	0.58	0.05	11.22	
When I have difficulty solving a problem, I enjoy trying different approaches to see which one will work.	0.78	0.08	9.69	

(R) = Reversed item

Observations = 164; $\chi^2 = 1037.2$, d.f. = 781, p-value < .001

CFI = 0.92, NNFI = 0.91, RMSEA = 0.045 (0.037 - 0.052)

Construct correlations	(1)	(2)	(3)	(4)	(5)	(6)
(1) Conscientiousness						
(2) Extraversion	0.21					
(3) Openness to experience	-0.07	0.26				
(4) Supervisory support	0.39	0.13	0.00			
(5) Affective motivation to lead	0.21	0.48	0.19	0.06		
(6) Calculative motivation to lead	-0.07	-0.03	0.11	-0.24	-0.31	
(7) Learning goal orientation	0.18	0.21	0.40	0.19	0.39	-0.18

Table 21. Means and standard deviations.

Variable	Mean	S.D.	Min	Max	Description	Source
Leader self-rating						
Clarifying roles	3.4	0.9	1.0	5.0	Eight leadership behaviors measured at weeks 0, 6, and 12. Four scale items per behavior based on Yukl, Gordon, and Taber (2002). Extent scale: 1 = Not at all, 5 = Very great extent, 6 = Not applicable / don't know. Mean of four items, omitting NAs. Survey 1 is used as a baseline.	Survey 1-3
Developing	3.1	0.9	1.0	5.0		
Recognizing	3.3	0.9	1.0	5.0		
Correcting	3.5	0.8	1.0	5.0		
Supporting	3.9	0.7	1.0	5.0		
Empowering	3.4	0.8	1.0	5.0		
Monitoring operations	3.1	0.9	1.0	5.0		
Short-term planning	2.9	0.9	1.0	5.0		
Subordinate rating of leader						
Clarifying roles	4.1	0.7	2.5	5.0	Subordinates' ratings of leaders' leadership behaviors at weeks 0, 6, and 12. Same scale as used for self-ratings. Survey 1 is used as a baseline.	Survey 1-3
Developing	4.1	0.7	1.8	5.0		
Recognizing	3.9	0.9	1.0	5.0		
Correcting	4.1	0.7	1.8	5.0		
Supporting	4.2	0.8	1.5	5.0		
Empowering	4.1	0.7	1.0	5.0		
Monitoring operations	4.0	0.7	2.0	5.0		
Short-term planning	3.9	0.7	1.8	5.0		
Manager rating of leader						
Clarifying roles (change)	5.0	0.9	2.0	7.0	Managers' retrospective rating of leaders' change in leadership behaviors over the past three months. Same eight behaviors as used for self-ratings. Single composite item for each leadership behavior based on Yukl, Gordon, and Taber (2002). Extent of change scale: 1 = Declined greatly, 4 = About the same, 7 = Improved greatly, 8 = Don't know.	Manager survey
Developing (change)	5.1	0.9	4.0	7.0		
Recognizing (change)	4.5	0.8	4.0	7.0		
Correcting (change)	4.7	0.9	2.0	7.0		
Supporting (change)	4.7	0.9	3.0	7.0		
Empowering (change)	4.7	0.9	3.0	7.0		
Monitoring operations (change)	4.8	1.0	3.0	7.0		
Short-term planning (change)	4.9	1.0	3.0	7.0		
Clarifying roles (base)	2.8	0.9	1.0	5.0	Managers' retrospective rating of leaders' leadership behaviors three months prior. Same eight behaviors as used for self-ratings. Single composite item for each leadership behavior based on Yukl, Gordon, and Taber (2002). Extent scale: 1 = Not at all, 5 = Very great extent, 6 = Not applicable / don't know.	Manager survey
Developing (base)	2.4	0.9	1.0	5.0		
Recognizing (base)	2.6	0.8	1.0	4.0		
Correcting (base)	2.8	0.9	1.0	5.0		
Supporting (base)	3.4	1.0	1.0	5.0		
Empowering (base)	2.7	0.9	1.0	5.0		
Monitoring ops. (base)	3.0	0.9	1.0	5.0		
Short-term plan. (base)	2.8	1.1	1.0	5.0		
Leader characteristics						
Percent audit vs. tax	75	33	0	100	Percentage of prior experience conducting audit vs. tax work: 100 = 100% tax work, 0 = 100% tax work.	Survey 1 or 2
Conscientiousness	4.2	0.5	2.2	5.0	Mean of seven items from IPIP pool (Goldberg, 2014): 1 = Very inaccurate, 5 = Very accurate.	Survey 1 or 2
Extraversion	3.4	0.7	1.9	4.9	Mean of seven items from IPIP pool (Goldberg, 2014): 1 = Very inaccurate, 5 = Very accurate.	Survey 1 or 2
Openness to experience	3.5	0.8	1.6	5.0	Mean of five items from IPIP pool (Goldberg, 2014): 1 = Very inaccurate, 5 = Very accurate.	Survey 1 or 2

Variable	Mean	S.D.	Min	Max	Description	Source
Supervisory support	5.5	1.1	2.5	7.0	Support from supervisors given to leaders. Mean of six items adapted from Yarnall (1998): 1 = Strongly disagree, 7 = Strongly agree.	Survey 1 or 2
Job level (1 = senior)	0.41	0.49	0.00	1.00	Job level: 1 = senior associate, 0 = associate.	Org. data
Tenure (years)	2.07	0.51	0.61	3.60	Tenure in the company in years.	Org. data
CPA (1 = yes)	0.56	0.50	0.00	1.00	Certified public accountant.	Org. data
Hire quarter					Four dummy variables for quarter leaders' were hired.	Org. data
Industry assignment					Dummy variables for leaders' primary industry responsibility.	Org. data
Region					Dummy variables for the four U.S. regions.	Org. data
Weekly hours worked	44	5	20	60	Average hours worked in last five weeks.	Survey 1-3
Opportunity to lead	58	32	0	100	Opportunity to lead in prior five weeks. Sum of two items for percentage of time leading.	Survey 1-3
Log no. of projects led	2.3	1.0	0.0	5.7	Log +1 sum of the number of tax and audit projects led.	Survey 1 or 2
Log total months leading	2.7	1.1	0.0	5.5	Log +1 sum of the months leading tax and audit projects and in other organizations.	Survey 1 or 2
Experience breadth	4.4	2.3	0.0	9.0	Index of nine leadership situations common to project leaders. Count of situations leaders have encountered.	Survey 1 or 2
Experience depth	2.9	0.7	1.0	4.4	Index of extent of leaders' experience with nine leadership situations. Extent scale: 1 = Very little, 5 = Very great. Mean of responses for the subset of situations leaders have experienced.	Survey 1 or 2
Cognitive ability	26	4	16	34	ACT score (range 1 to 36) or SAT score converted to ACT equivalent.	Survey 1 or 2
Affective motivation to lead	5.3	0.9	2.8	7.0	Mean of five items from Chan and Drasgo's (2001) motivation to lead scale: 1 = Strongly disagree, 7 = Strongly agree.	Survey 1 or 2
Calculative motivation to lead	2.3	1.0	1.0	6.5	Mean of four items from Chan and Drasgo's (2001) motivation to lead scale: 1 = Strongly disagree, 7 = Strongly agree.	Survey 1 or 2
Learning goal orientation	6.0	0.7	3.4	7.0	Mean of eight items from Button, Mathieu, and Zajac (1996): 1 = Strongly disagree, 7 = Strongly agree.	Survey 1 or 2
Self-efficacy at week 0	6.5	1.5	1.3	9.6	Leaders' confidence in their leadership ability. Content-specific measure based on Bandura's (2006) guide for constructing self-efficacy scales. Mean of ten items: 0 = Cannot do at all, 10 = Highly certain can do.	Survey 1
Subordinate characteristics						
Agreeableness (subordinate)	4.2	0.5	2.0	5.0	Mean of eight items from IPIP pool (Goldberg, 2014): 1 = Very inaccurate, 5 = Very accurate.	Survey 1, 2, or 3
Relationship months (subordinate)	7	5	0	24	Number of months subordinate has worked with leader.	Survey 1, 2, or 3
Manager characteristics						
Observation extent (manager)	3.5	0.9	2.0	5.0	Managers' extent of observation of leaders. Single item: 1 = None, 5 = Very great extent.	Manager survey

Table 22. Bivariate correlations.

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)	(10)	(11)	(12)
Leader self-rating												
(1) Clarify. roles												
(2) Developing	0.79											
(3) Recognizing	0.51	0.58										
(4) Correcting	0.56	0.56	0.63									
(5) Supporting	0.32	0.33	0.45	0.49								
(6) Empowering	0.48	0.45	0.45	0.53	0.35							
(7) Monitor. ops.	0.65	0.63	0.65	0.62	0.36	0.46						
(8) Short-term pl.	0.63	0.61	0.55	0.52	0.29	0.52	0.65					
Subordinate rating												
(9) Clarify. roles	-0.10	-0.10	0.00	0.00	0.00	-0.18	0.04	-0.17				
(10) Developing	0.05	0.08	0.06	-0.01	0.10	-0.08	0.12	-0.04	0.65			
(11) Recognizing	0.00	0.03	0.11	0.03	0.12	-0.04	0.15	-0.13	0.52	0.68		
(12) Correcting	-0.01	-0.01	0.00	0.05	0.12	0.01	0.16	-0.10	0.64	0.74	0.76	
(13) Supporting	-0.11	-0.09	0.01	0.05	0.08	-0.02	0.14	-0.20	0.50	0.63	0.75	0.82
(14) Empowering	0.05	0.12	-0.01	0.00	0.04	0.08	0.12	-0.01	0.37	0.45	0.39	0.53
(15) Monitor. ops.	0.01	0.02	-0.04	0.01	0.02	-0.17	0.08	-0.06	0.68	0.64	0.55	0.62
(16) Short-term pl.	0.02	-0.10	-0.06	-0.02	0.07	-0.18	0.05	-0.06	0.63	0.60	0.57	0.59
Manager rating												
(17) Clarify. roles (chg.)	0.09	0.11	0.05	0.02	0.06	0.13	0.04	0.02	-0.12	-0.11	-0.07	-0.09
(18) Developing (chg.)	0.06	0.07	0.08	-0.03	-0.02	0.08	0.01	0.06	-0.02	0.04	0.06	-0.03
(19) Recognizing (chg.)	-0.11	-0.03	0.07	0.00	-0.05	-0.01	-0.01	0.00	0.13	0.10	0.11	0.11
(20) Correcting (chg.)	0.17	0.15	0.19	0.13	0.12	0.12	0.09	0.17	-0.03	0.03	0.03	-0.07
(21) Supporting (chg.)	0.04	0.12	0.10	0.01	-0.07	0.03	0.14	0.13	0.08	0.08	-0.02	0.10
(22) Empowering (chg.)	0.00	0.11	0.13	0.03	0.03	-0.03	0.08	0.06	0.01	0.07	-0.09	-0.07
(23) Monitor. ops. (chg.)	-0.06	0.04	0.06	-0.01	-0.02	-0.01	0.06	0.06	0.06	0.09	0.02	0.03
(24) Short-term pl. (chg.)	-0.10	-0.06	-0.01	-0.10	-0.10	0.03	0.01	-0.01	0.08	0.21	0.14	0.15
(25) Clarify. roles (base)	0.12	0.15	0.11	0.07	-0.05	0.06	0.09	0.08	0.06	0.17	0.09	0.10
(26) Developing (base)	0.13	0.19	0.20	0.16	0.00	0.04	0.12	0.12	0.04	0.11	0.04	0.00
(27) Recognizing (base)	0.18	0.19	0.15	0.15	0.01	-0.03	0.09	0.07	-0.13	0.05	0.10	-0.02
(28) Correcting (base)	0.17	0.20	0.11	0.16	0.04	0.13	0.09	0.12	0.10	0.11	0.06	0.06
(29) Supporting (base)	0.13	0.06	0.08	0.10	0.11	0.17	0.07	0.02	-0.10	0.15	0.25	0.12
(30) Empowering (base)	0.22	0.28	0.17	0.21	0.07	0.16	0.16	0.14	0.05	0.15	0.15	0.20
(31) Monitor. ops. (base)	0.20	0.23	0.15	0.08	0.07	0.11	0.09	0.09	-0.01	-0.04	-0.08	-0.11
(32) Short-term pl. (base)	0.14	0.13	0.07	0.06	-0.02	0.03	0.07	0.06	0.05	0.04	0.04	0.05
Individual characteristics												
(33) Pct. audit	0.25	0.14	-0.02	0.09	-0.05	0.16	0.10	0.15	-0.04	-0.09	-0.08	0.00
(34) Conscientiousness	0.12	0.09	0.12	0.17	0.12	0.10	0.22	0.14	-0.10	-0.16	-0.18	-0.23
(35) Extraversion	0.09	0.13	0.23	0.11	0.05	0.12	0.16	0.16	-0.06	-0.06	0.04	-0.05
(36) Openness to exper.	0.12	0.10	0.20	0.11	0.21	0.04	0.09	0.02	0.02	0.18	0.27	0.14
(37) Supervisory sup.	0.14	0.08	0.15	0.16	0.14	0.09	0.16	0.11	-0.03	0.06	0.06	-0.04
(38) Job level	0.17	0.14	0.04	0.09	0.02	-0.01	0.13	0.05	0.04	0.11	0.06	0.11
(39) Tenure (yrs.)	0.12	0.07	-0.13	0.08	-0.01	0.07	0.04	0.07	-0.10	-0.01	-0.09	-0.03
(40) CPA (1 = yes)	0.03	-0.01	-0.03	0.00	0.00	-0.07	-0.03	-0.13	0.11	0.00	-0.03	-0.01
(41) Work hrs. / week	0.21	0.25	0.19	0.13	0.10	0.15	0.20	0.20	-0.01	-0.05	0.04	-0.06
(42) Oppor. to lead	0.42	0.39	0.32	0.30	0.12	0.21	0.33	0.35	-0.20	-0.12	0.01	-0.17
(43) Log no. proj. led	0.18	0.24	0.13	0.12	0.03	0.06	0.14	0.09	-0.05	0.06	0.00	-0.10
(44) Log tot. mos. lead.	0.19	0.21	0.14	0.16	0.05	0.06	0.19	0.13	0.11	0.16	0.07	0.07
(45) Exper. breadth	0.23	0.31	0.26	0.23	0.09	0.07	0.26	0.23	-0.10	0.02	-0.10	-0.08
(46) Exper. depth	0.25	0.27	0.28	0.23	0.20	0.13	0.28	0.27	-0.04	-0.01	-0.01	0.01

