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Exploratory Innovation, Exploitative Innovation, and Performance: Effects of Organizational Antecedents and Environmental Moderators

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Research on exploration and exploitation is burgeoning, yet our understanding of the antecedents and consequences of both activities remains rather unclear. We advance the growing body of literature by focusing on the apparent differences of exploration and exploitation and examining implications for using formal (i.e., centralization and formalization) and informal (i.e., connectedness) coordination mechanisms. This study further examines how environmental aspects (i.e., dynamism and competitiveness) moderate the effectiveness of exploratory and exploitative innovation. Results indicate that centralization negatively affects exploratory innovation, whereas formalization positively influences exploitative innovation. Interestingly, connectedness within units appears to be an important antecedent of both exploratory and exploitative innovation. Furthermore, our findings reveal that pursuing exploratory innovation is more effective in dynamic environments, whereas pursuing exploitative innovation is more beneficial to a unit's financial performance in more competitive environments. Through this richer explanation and empirical assessment, we contribute to a greater clarity and better understanding of how ambidextrous organizations coordinate the development of exploratory and exploitative innovation in organizational units and successfully respond to multiple environmental conditions.

Key words: organizational learning; performance; coordination mechanisms; exploration/exploitation *History*: Accepted by John W. Boudreau, organizational behavior, performance, strategy, and design; received October 25, 2004. This paper was with the authors 7 months for 1 revision.

As competition intensifies and the pace of change accelerates, firms need to renew themselves by exploiting existing competencies and exploring new ones (Floyd and Lane 2000). The notion of exploration and exploitation (March 1991) has emerged as an underlying theme in research on organizational learning and strategy (Levinthal and March 1993, Vera and Crossan 2004), innovation (Danneels 2002, Lee et al. 2003, Rothaermel and Deeds 2004), and entrepreneurship (Shane and Venkataraman 2000). Various literatures have argued that organizations need to become ambidextrous (Gibson and Birkinshaw 2004, He and Wong 2004) and develop exploratory and exploitative innovation simultaneously in different organizational units (e.g., Benner and Tushman 2003, Tushman and O'Reilly 1996). Units that engage in exploratory innovation pursue new knowledge and develop new products and services for emerging customers or markets. Units pursuing exploitative innovation build on existing knowledge and extend existing products and services for existing customers (Benner and Tushman 2003, p. 243). While the importance of pursuing both types of innovation has often been highlighted, much more remains to be understood about how ambidextrous organizations coordinate the development of exploratory and exploitative innovation in organizational units.

First, there is little systematic evidence on whether units adopt different coordination mechanisms to develop exploratory and exploitative innovation. Although previous research has asserted that organizational antecedents differentially influence exploratory and exploitative innovation (e.g., Benner and Tushman 2003, Hill and Rothaermel 2003), empirical studies examining such relationships with radical and incremental types of innovation produced mixed results (Cardinal 2001, Damanpour 1991, Ettlie et al. 1984, Dewar and Dutton 1986). Thus, it appears that the central tenet of units using diverse coordination mechanisms for exploratory and exploitative innovation remains unproven. The mixed findings may stem from the fact that previous studies have used the firm or business unit as a unit of analysis, ignoring the fact that ambidextrous organizations might differentiate coordination mechanisms at the level of the organizational unit. Moreover, prior research has tended to focus on formal hierarchical structure, thereby ignoring the increasing importance of informal social relations in coordinating the development of exploratory and exploitative innovation (Subramaniam and Youndt 2005). Cardinal (2001), for instance, argued that, in addition to formal controls, informal social relations determine the extent to which exploratory and exploitative innovation can be developed, yet the impact of formal hierarchical structure and informal social relations on exploratory and exploitative innovation has not been studied in an integrated model. Focusing on organizational units, this study contributes to previous research through examining how formal and informal coordination mechanisms influence a unit's exploratory and exploitative innovation.

Second, a key characteristic of the strategic management discipline is its emphasis on a firm's competitive environment. Prior studies have found that the effectiveness of a strategic orientation (Hambrick 1983, Snow and Hrebiniak 1980), entrepreneurial orientation (Lumpkin and Dess 2001), or innovativeness (Zahra 1996, Zahra and Bogner 1999) depends on environmental aspects. Less well documented is the contingency perspective that underscores the effectiveness of a unit's exploratory and exploitative innovation under different contextual conditions. Levinthal and March (1993) and Lewin et al. (1999), for instance, posited that environmental aspects such as environmental dynamism and competitiveness moderate the relationship between both types of innovation and performance. Currently, there is little empirical evidence on the nature of this moderating effect and how it affects a unit's financial performance. This study examines these effects and provides a fuller understanding of how organizations may successfully respond to multiple environmental conditions through pursuing exploratory and exploitative innovations in organizational units. It suggests that both types of innovation may lead to diverse performance outcomes under different contextual conditions.

In summary, drawing from theories of organizational learning and strategic management, this study asserts that organizational units use different formal and informal coordination mechanisms to develop exploratory and exploitative innovations. We advance the growing body of literature on exploration and exploitation by focusing on the apparent differences between the concepts and the implications for using coordination mechanisms. This study further suggests that the impact of exploratory and exploitative innovation on a unit's financial performance is moderated by environmental aspects. Through this richer explanation and empirical assessment, we contribute to a greater clarity and better understanding of how ambidextrous organizations coordinate the development of exploratory and exploitative innovation in organizational units and successfully respond to multiple environmental conditions. In the next section, we present the literature review and hypotheses. We examine the relationships among organizational antecedents, exploratory and exploitative innovation, environmental moderators, and financial performance. After describing our research method, we present the empirical findings using data on 283 organizational units from 115 autonomous branches of a large European financial services firm. We conclude with a discussion of the results, implications, and issues for further research.

Literature Review and Hypotheses

Exploratory and Exploitative Innovation

Following previous literatures, we classify innovations along two domains: (1) the proximity to existing technologies, products, and services, and (2) the proximity to existing customer or market segments (Abernathy and Clark 1985, Benner and Tushman 2003, Danneels 2002). Exploratory innovations are radical innovations and are designed to meet the needs of emerging customers or markets (Benner and Tushman 2003, p. 243; Danneels 2002). They offer new designs, create new markets, and develop new channels of distribution (Abernathy and Clark 1985). Exploratory innovations require new knowledge or departure from existing knowledge (Benner and Tushman 2002, Levinthal and March 1993, McGrath 2001). Conversely, exploitative innovations are incremental innovations and are designed to meet the needs of existing customers or markets (Benner and Tushman 2003, p. 243; Danneels 2002). They broaden existing knowledge and skills, improve established designs, expand existing products and services, and increase the efficiency of existing distribution channels (Abernathy and Clark 1985, p. 5). Hence, exploitative innovations build on existing knowledge and reinforce existing skills, processes, and structures (Abernathy and Clark 1985, Benner and Tushman 2002, Levinthal and March 1993, Lewin et al. 1999).

Organizational Antecedents of Exploratory and Exploitative Innovation

Organizational units use various coordination mechanisms to link and integrate different parts of their unit (Tushman and O'Reilly 1996, Van de Ven 1986). Coordination mechanisms direct attention and group together key resources and interdependent functions needed to develop innovations (Van de Ven 1986). However, they may differentially influence a unit's ability to pursue exploratory and exploitative innovation. Therefore, we examine two generic types of coordination mechanisms: (1) the formal hierarchical structure, and (2) informal social relations (cf. Ghoshal et al. 1994, Tsai 2002).

Formal Hierarchical Structure. The formal hierarchical structure constitutes one of the most important ways of coordinating activities. We examine two main elements of a unit's hierarchical structure: centralization and formalization (e.g., Cardinal 2001, Lin and Germain 2003, Miller and Droge 1986, Zmud 1982). Centralization of decision making reflects the locus of authority and decision making (Damanpour 1991) and refers to the extent to which decision making is concentrated in an organization (Aiken and Hage 1968). Centralization narrows communication channels (Cardinal 2001) and reduces the quality and quantity of ideas and knowledge retrieved for problem solving (Nord and Tucker 1987, Sheremata 2000). In addition, it decreases the sense of control over work and diminishes the likelihood that unit members seek innovative and new solutions (Atuahene-Gima 2003, Damanpour 1991). Because exploratory innovation requires nonroutine problem solving and deviation from existing knowledge, centralization of decision making is likely to reduce exploratory innovation. Conversely, previous research has suggested that centralized authority is beneficial to speeding up exploitative innovation (Sheremata 2000). Exploitative innovation is limited in scope and newness, and generates less uncertainty about requisites for organizational units (Gopalakrishnan and Damanpour 1994). In this regard, effective decision-making processes for pursuing exploitative innovation tend to be narrowly channeled and more centralized (Cardinal 2001). Centralization of decision authority, therefore, increases information-processing efficiency and facilitates exploitative innovation.

HYPOTHESIS 1. The higher a unit's centralization of decision making, (a) the lower its level of exploratory innovation, and (b) the higher its level of exploitative innovation.

Formalization is the degree to which rules, procedures, instructions, and communications are formalized or written down (Khandwalla 1977). The reliance on rules and procedures hampers experimentation and ad hoc problem-solving efforts (March and Simon 1958), and reduces the likelihood of individuals deviating from structured behavior (Weick 1979). Formalization acts as a frame of reference that constrains exploration efforts and directs attention toward restricted aspects of the external environment (Weick 1979). It hinders deviation from existing knowledge and a unit's variation-seeking behavior. Accordingly, formalization constrains exploratory innovations. Rather, formalization is generally established to respond to environmental phenomena in a known way (Daft and Lengel 1986, Lyles and Schwenk 1992). Formalization is aimed at reducing variance through incremental improvements in

processes and outputs (Benner and Tushman 2003). Zollo and Winter (2002), for instance, argue that formalization facilitates the generation of proposals to improve existing routines. Once changed, these improved routines become standardized activities that will be performed for existing sets of customers (Benner and Tushman 2003). Through formalization, units codify best practices to make them more efficient to exploit, easier to apply, and to accelerate their implementation (Zander and Kogut 1995). Thus, formalization enhances exploitative innovations through improvement of current products, services, and processes.

Hypothesis 2. The higher a unit's formalization, (a) the lower its level of exploratory innovation, and (b) the higher its level of exploitative innovation.

Informal Social Relations. Informal social relations concern personal linkages between people and comprise a more voluntary mode of coordination than hierarchical structure (Tsai 2002). Although previous research has shown that interfirm or interunit relations affect knowledge transfer and learning (Dhanaraj et al. 2004, Hansen 2002, Uzzi and Lancaster 2003), the impact of social relations among individuals within units on exploratory and exploitative innovation remains unclear. Therefore, our study examines the structural dimension of social relations, which concerns the overall pattern of a unit's social network in terms of density or connectedness (Nahapiet and Ghoshal 1998, Sheremata 2000, Tsai and Ghoshal 1998, Uzzi 1997).

Connectedness increases opportunities for informal hall talk and accessibility to knowledge sources within organizational units (Jaworski and Kohli 1993). It helps a range of individuals to combine knowledge and develop new knowledge underlying exploratory innovation (Atuahene-Gima 2003, McFadyen and Cannella 2004). In addition, Subramaniam and Youndt (2005) argue that social relations assist in establishing legitimacy and in enabling adoption of exploratory innovation. Beyond a moderate level, however, the density of social networks may limit access to divergent perspectives and to alternative ways of doing things (Nahapiet and Ghoshal 1998, p. 245). As highly dense networks diffuse strong norms and establish shared behavioral expectations, they reduce deviant behavior, limit search scope, and increase selective perception of alternatives (Rowley et al. 2000, Uzzi 1997). Dense social relations among unit members, therefore, will eventually constrain departure from existing knowledge and decrease a unit's exploratory innovation. Accordingly, we expect an inverted U-shaped relationship between connectedness and exploratory innovation. To pursue exploitative innovation, on the other hand, organizational units need to efficiently draw on and refine prevailing knowledge (Subramaniam and Youndt 2005). Connectedness is advantageous for developing trust and cooperation among unit members (Adler and Kwon 2002, Walker et al. 1997). It permits individuals to develop a deep understanding to further refine and improve existing products, processes, and markets (Rowley et al. 2000). Moreover, dense social relations enable unit members to share experiences with regard to how to implement certain improvements (Dyer and Nobeoka 2000). Connectedness within organizational units, therefore, facilitates improving existing knowledge resources and increases a unit's exploitative innovation.

HYPOTHESIS 3. (a) There will be an inverted U-shaped relationship between a unit's connectedness among its members and the level of exploratory innovation. (b) The higher a unit's connectedness among its members, the higher its level of exploitative innovation.

The Moderating Role of External Environment on the Effectiveness of Exploratory and Exploitative Innovations

The impact of the external environment on innovativeness and performance has been widely acknowledged (e.g., Zahra 1996, Zahra and Bogner 1999). Miller and Friesen (1983), for instance, found that environmental aspects moderate the relationship between innovation and performance. Regarding exploratory and exploitative innovations, previous literatures argued that environmental dynamism and competitiveness are likely to moderate the impact of both types of innovations on performance (Levinthal and March 1993, Lewin et al. 1999).

Environmental dynamism refers to the rate of change and the degree of instability of the environment (Dess and Beard 1984). Previous research not only reflects environmental dynamism through the amount of change, but also through the unpredictability of change (cf. Dess and Beard 1984). Dynamic environments may be characterized by changes in technologies, variations in customer preferences, and fluctuations in product demand or supply of materials. Dynamic environments make current products and services obsolete and require that new ones be developed (Jansen et al. 2005, Sorensen and Stuart 2000). To minimize this threat of obsolescence, organizational units need to introduce exploratory innovations that depart from existing products, services, and markets. Organizational units that pursue such innovations can capitalize on changing circumstances by creating new products and services or meeting the needs of emerging markets (Zahra 1996). They create opportunities for above-normal return by targeting premium market segments (Levinthal and March 1993, Zahra and Bogner 1999) and creating new

niches (Lumpkin and Dess 2001). Hence, in dynamic environments, we expect organizational units that are pursuing exploratory innovations to increase their financial performance. Conversely, organizational units that pursue exploitative innovations are likely to decrease their performance. Such organizational units are inclined to exploit existing products, services, and markets. They are likely to fall behind because they become consistently better at performing routines that are less and less valued by the environment (Sorensen and Stuart 2000). Accordingly,

Hypothesis 4. Environmental dynamism (a) positively moderates the relationship between exploratory innovation and financial performance, and (b) negatively moderates the relationship between exploitative innovation and financial performance.

Environmental competitiveness is the extent to which external environments are characterized by intense competition (Matusik and Hill 1998). It refers to the degree of competition reflected in the number of competitors and the number of areas in which there is competition (Miller 1987). Competitive environments have been associated with intensive pressures for higher efficiency and lower prices (Matusik and Hill 1998) that lead to tighter margins and less organizational slack (Zahra 1996). Miller and Friesen (1983, p. 223) argue that extensive risk taking, forceful proactiveness, and strong emphasis on novelty (i.e., exploratory innovation) can be hazardous when competitive conditions become more demanding. Outcomes of exploratory innovations tend to rapidly become diffused over the population of competitors (Levinthal and March 1993). Moreover, environmental competitiveness usually reduces available resources for exploratory innovations (Miller and Friesen 1983, Zahra 1996), and pursuing such highrisk and high-cost innovations would considerably harm the viability of organizational units (Zahra and Bogner 1999). We therefore propose that environmental competitiveness negatively moderates the effectiveness of exploratory innovations. Conversely, organizational units reacting to existing trends and demands through modifying or expanding current products, services, and markets (i.e., exploitative innovation) are likely to enhance their performance in competitive environments (Lumpkin and Dess 2001). They pursue exploitative innovations to better cater to existing customers and build customer loyalty without substantial costs associated with exploratory innovations. Through increased advertising and enhanced tailoring of existing products and services (Miller 1987), these organizational units try to charge a premium and capture additional market share (Zahra and Bogner 1999). Accordingly, organizational units pursuing exploitative innovation in competitive environments are likely to increase their financial performance.

Hypothesis 5. Environmental competitiveness (a) negatively moderates the relationship between exploratory innovation and financial performance, and (b) positively moderates the relationship between exploitative innovation and financial performance.

Method

Setting and Data Collection

The empirical research was conducted at a large European financial services firm. The financial services sector is an interesting case for innovation researchers because it has been confronted with the blurring of industry boundaries and with new entrants from, among others, the retail and telecom industries (Flier et al. 2003). These changes have triggered incumbent financial services firms to pursue several exploratory and exploitative innovations, such as the introduction of ATMs, Internet banking, and mobile banking (Han et al. 1998, Pennings and Harianto 1992). The firm has total assets of more than \$350 billion and ranks among the top 30 on the Fortune Global 500 in terms of total revenue in the banking industry. It is a broadbased financial service provider with branches in various countries. These branches are geographically distinct, autonomous decision entities, each with its own board of directors. The branches have autonomy with respect to types of products and services offered and markets within which to provide these products and services. Organizational units in these branches provide products and services that cover asset management, mortgages, loans and savings, insurance, leasing, equity participation, corporate banking, and investment banking. Each organizational unit has its own management team with budget responsibilities regarding several aspects of its operations, such as pursuing exploratory and exploitative innovation. Moreover, organizational units within branches operate in markets with varying levels of environmental dynamism and competitiveness—a condition required to observe units pursuing different innovative activities (Han et al. 1998).

To deal with potential problems associated with single-informant bias and common-method bias, we temporarily separated the measurement of independent and dependent variables and collected data at two different points in time. In 2002, a survey assessing centralization, formalization, and connectedness was administered to the general manager of 769 organizational units within 220 branches in one country. To ensure confidentiality, we agreed not to reveal the name of the manager and asked each manager to return the questionnaire directly to the research

team. Unit managers from 462 organizational units returned their questionnaire, representing a response rate of 60%. In 2003, approximately 10 months after the first survey, a second survey was mailed to the same 462 organizational unit managers to assess their unit's exploratory innovation, exploitative innovation, environmental dynamism, and competitiveness. We received 283 surveys from organizational units in 115 branches, representing a final response rate of 36.8%. The respondents of these 283 organizational units had a mean company tenure of 7.85 years (s.d. = 8.24). The average size of the organizational units was 33.37 (s.d. = 20.79) full-time employees.

To test for nonresponse bias, we examined differences between respondents and nonrespondents for our final sample. T-tests showed no significant differences based on the number of full-time employees of organizational units and their associated branches, total assets of branches, and units' prior performance. We also compared early and late respondents in terms of demographic characteristics and model variables. These comparisons did not reveal any significant differences (p < 0.05), indicating that nonresponse bias was not a problem.

To examine reliability issues associated with singleinformant data, we surveyed two additional members of the 283 responding organizational units in 2003. Both management team members and senior employees of organizational units were asked to participate and to assess their unit's exploratory innovation, exploitative innovation, environmental dynamism, and environmental competitiveness. This follow-up survey resulted in 79 responses from 56 organizational units, or 19.8% of the organizational units from the final sample that were comparable in size, age, and prior performance to our final sample. We calculated an interrater agreement score (r_{wg}) for data on these variables (James et al. 1993). The median interrater agreements were 0.74, 0.78, 0.91, and 0.89, respectively, for exploratory innovation, exploitative innovation, environmental dynamism, and environmental competitiveness, suggesting adequate agreement. Intraclass correlations revealed a strong level of interrater reliability: Correlations were consistently significant at the 0.001 levels (Jones et al. 1983).

Measurement and Validation of Constructs

This study used existing scales from the literature, but appropriate scales for exploratory and exploitative innovation were not available. Therefore, we reviewed relevant literature and generated a pool of items to tap the domain of each construct. Next, to enhance the construct validity of the survey measures, we conducted a pretest involving in-depth pilot interviews with 15 managers with various tenures at different branches. The managers were asked to complete the questionnaire and to indicate any phrasing

of the items that they thought was ambiguous. During follow-up interviews, managers were invited to provide suggestions for improvement of the questionnaire. After this pretest, the phrasing of items was further enhanced by the authors and peers, resulting in the final version. The appendix provides all items of study variables.

Dependent Variables. Financial performance of organizational units was measured through internal corporate records by a unit's average profitability from 2003 up to one year after the measurement of exploratory and exploitative innovation. Because organizational units may have different strategic priorities, we adjusted financial performance data to evaluate each organizational unit. Following Tsai (2001), we used a unit's profitability-achieved rate, which is a unit's profitability divided by its target profitability. We ascertained a unit's profitability as well as target profitability through internal corporate records. We averaged the profitability-achieved rate over a one-year period to help guard against random fluctuations in the data.

To develop measures for exploratory and exploitative innovation, we generated items on a seven-point scale by carefully examining existing literature (Abernathy and Clark 1985, Benner and Tushman 2003, Lewin et al. 1999, March 1991, Uzzi and Lancaster 2003) and analyzing interviews with managers at branches of the financial services firm. The resulting six-item measure for exploratory innovation ($\alpha = 0.86$) captured the extent to which units depart from existing knowledge and pursue innovations for emerging customers or markets. In the context of financial services, exploratory innovation is related to developing new products and services such as fundamentally new loan structures and contingent contracts not previously provided by organizational units (Uzzi and Lancaster 2003). The measure for exploitative innovation ($\alpha = 0.80$) captured the extent to which units build on existing knowledge and meet the needs of existing customers (Abernathy and Clark 1985, Benner and Tushman 2003, Danneels 2002). Prior research on financial services has related exploitative innovation to aggressive lending, shopping the market, and increasing efficiency (e.g., Uzzi and Lancaster 2003). To further examine reliability and ensure validity of our measures for exploratory and exploitative innovation, we measured both types of innovation at the branch level through surveying managing directors from our sample of branches in 2003. A total of 110 questionnaires were completed and returned. First, alpha reliabilities of exploratory and exploitative innovations in the sample of managing directors were 0.86 and 0.77, respectively, revealing strong reliability of both measures. Second, we conducted exploratory factor analysis of the 12 items pertaining

to exploratory and exploitative innovation. Results revealed a two-factor solution with significant factor loadings above 0.58 and cross-loadings below 0.29, indicating convergent and discriminant validity of both measures in the sample of managing directors. Third, correlations between exploratory and exploitative innovation at the branch level and the average level of both types of innovations among organizational units within the same branch were positive and significant (p < 0.01). These findings provided strong support for the reliability and validity of our two measurements for exploratory and exploitative innovation.

Independent and Moderating Variables. We used the subconstruct of hierarchy of authority (Hage and Aiken 1967) to measure centralization of decision making ($\alpha = 0.71$). As Dewar et al. (1980) indicate, the scale is found to be both reliable and valid. To measure formalization, we used a five-item formalization scale ($\alpha = 0.74$) from Desphandé and Zaltman (1982). Connectedness ($\alpha = 0.78$) was measured with a fiveitem scale adapted from Jaworski and Kohli (1993). They developed a scale for connectedness that measured the extent to which employees were networked to various levels of the hierarchy in their organizational unit. Based on previous literatures, a five-item measure was included that captured environmental dynamism (cf. Dill 1958, Volberda and Van Bruggen 1997). The scale for environmental dynamism ($\alpha = 0.87$) tapped into the rate of change and the instability of the external environment. A four-item scale was used for environmental competitiveness ($\alpha = 0.86$) that measured the extent to which a unit's external environment is characterized by intense competition that is reflected in the number of competitors and the number of areas in which there is competition (Birkinshaw et al. 1998, Jaworski and Kohli 1993).

We assessed the construct validity of all items pertaining to our constructs through exploratory and confirmatory factor analysis (CFA). Exploratory factor analysis of all items (dependent variables, independent variables, and moderating variables) clearly replicated the intended seven-factor structure. Each item loaded clearly on its intended factor (all factor loadings were above 0.61 with cross-loadings below 0.34), and all factors had eigenvalues greater than one, supporting the seven-factor solution. An integrated CFA on all items (with each item constrained to load only on the factor for which it was the proposed indicator) yielded a model that fits the data well $(\chi^2/df = 2.20, \text{ goodness-of-fit index (GFI)} = 0.92, \text{ com-}$ parative fit index (CFI) = 0.91, and root-mean-square error of approximation (RMSEA) = 0.056). Item loadings were as proposed and significant (p < 0.01). To examine discriminant validity, we also assessed two-factor models for each pair. Constraining each correlation in the second model to unity and examining the difference in chi-square values, we found significant test statistics (p < 0.001) for each pair. Accordingly, the measurements used in our study are not only theoretically, but also empirically distinguishable.

Control Variables. In the empirical study, we controlled for possible confounding effects by including various relevant control variables. Because larger units may have more resources yet may lack the flexibility to explore, we included the natural logarithm of the number of full-time employees within units to account for unit size. Organizational units situated in large branches may also have access to available branch resources that can be used to develop exploratory and exploitative innovation (Gooding and Wagner 1985). Accordingly, we included branch size as the natural logarithm of the number of fulltime employees within a branch. A unit's age, measured by the number of years from its founding, was also included. Previous studies have shown that older units may have increased cumulative experience that enhances innovation; however, they may also encounter problems in keeping abreast of external developments (Sorensen and Stuart 2000). The number of functional areas represented in a unit is beneficial to considering a greater range of perspectives and to facilitating creativity (Milliken and Martins 1996, Moorman and Miner 1997), yet functional diversity may create difficulties in resolving differences among perspectives and may slow down exploitative innovation. We therefore controlled for functional diversity measured as the number of functional areas represented in organizational units (e.g., Sethi et al. 2001). To control for the effect that units may specialize in different markets and have different ranges of products and services, we included unit client focus that indicates whether the unit provided products and services for private clients (coded as 0) or for business clients (coded as 1). Organizational units with a strong history of high performance are likely to invest in innovation. Hence, we included a unit's past performance measurements. Because units may have different strategic priorities, we adjusted performance data to evaluate each unit. Following Tsai (2001), we used a unit's profitability-achieved rate (a unit's profitability divided by its target profitability). We also controlled for a branch's past performance and included a branch's profitability-achieved rate (a branch's return on investment divided by its target return). The past performance measurements as well as the achieved rates for the units and branches in this study for the period 2000–2002 were ascertained through internal corporate records.

Analysis and Results

Table 1 presents descriptive statistics and correlations for the study variables. Table 2 presents the results of the hierarchical regression analyses for exploratory innovation, exploitative innovation, and financial performance. Prior to the creation of the interaction terms in Model 6 (Table 2), we mean centered the independent variables to reduce multicollinearity (Aiken and West 1991). Moreover, to examine multicollinearity, we calculated variance inflation factors (VIF) for each of the regression equations. The maximum VIF within the models was 1.44, which is well below the rule-of-thumb cut-off of 10 (Neter et al. 1990).

Table 1 Means, Standard Deviations, and Correlations

| | | Mean | St. dev. | (1) | (2) | (3) | (4) | (5) | (6) | (7) | (8) | (9) | (10) | (11) | (12) | (13) | (14) | (15) |
|-----|-------------------------------|--------|----------|-------|--------|--------|--------|--------|--------|--------|--------|-------|-------|-------|-------|-------|------|------|
| 1. | Financial performance unit | 103.12 | 23.00 | _ | | | | | | | | | | | | | | |
| 2. | Exploratory innovation | 3.77 | 1.10 | 0.18 | (0.86) | | | | | | | | | | | | | |
| 3. | Exploitative innovation | 5.27 | 0.71 | 0.03 | 0.07 | (0.80) | | | | | | | | | | | | |
| 4. | Centralization of | 2.90 | 1.13 | -0.04 | -0.19 | -0.01 | (0.71) | | | | | | | | | | | |
| _ | decision making | F F0 | 0.70 | 0.01 | 0.40 | 0.00 | 0.14 | (0.74) | | | | | | | | | | |
| | Formalization | 5.53 | 0.76 | -0.01 | -0.10 | 0.20 | -0.14 | (0.74) | | | | | | | | | | |
| 6. | Connectedness | 5.54 | 0.87 | 0.04 | 0.23 | 0.21 | 0.02 | 0.07 | (0.78) | | | | | | | | | |
| 7. | Environmental dynamism | 4.34 | 1.20 | 0.11 | 0.41 | 0.12 | -0.04 | 0.06 | 0.23 | (0.87) | | | | | | | | |
| 8. | Environmental competitiveness | 4.64 | 1.24 | -0.11 | 0.16 | 0.26 | -0.09 | 0.11 | 0.14 | 0.43 | (0.86) | | | | | | | |
| 9. | Unit size* | 3.33 | 0.62 | 0.03 | -0.09 | 0.00 | -0.12 | -0.02 | -0.18 | -0.10 | -0.05 | _ | | | | | | |
| 10. | Branch size* | 4.87 | 0.44 | 0.08 | 0.30 | 0.05 | -0.04 | -0.03 | 0.08 | 0.30 | 0.23 | 0.29 | _ | | | | | |
| 11. | Unit age | 3.15 | 2.75 | -0.10 | -0.07 | -0.07 | 0.01 | 0.08 | 0.16 | -0.08 | -0.04 | -0.17 | -0.12 | _ | | | | |
| 12. | Functional diversity | 3.20 | 1.84 | 0.08 | 0.04 | -0.02 | 0.04 | -0.05 | -0.09 | 0.10 | 0.00 | 0.50 | 0.09 | -0.10 | | | | |
| 13. | Unit client focus | 0.40 | 0.49 | 0.33 | 0.09 | -0.11 | 0.05 | -0.19 | 0.01 | -0.09 | -0.28 | -0.01 | 0.04 | 0.05 | 0.01 | _ | | |
| 14. | Unit past performance | 102.34 | 23.87 | 0.53 | 0.12 | -0.07 | -0.02 | -0.03 | 0.01 | 0.08 | -0.12 | -0.15 | -0.15 | 0.01 | -0.02 | 0.18 | _ | |
| 15. | Branch past performance | 102.35 | 26.82 | 0.19 | 0.05 | 0.06 | -0.06 | -0.01 | 0.01 | -0.03 | -0.04 | 0.07 | -0.03 | -0.09 | 0.04 | -0.03 | 0.15 | _ |

Note. n = 283. Numbers in parentheses on the diagonal are Cronbach's alphas of the composite scales. All correlations above |0.11| are significant at p < 0.05.

*Log number of full-time employees.

Table 2 Results of Hierarchical Regression Analyses: Effects on Exploratory Innovation, Exploitative Innovation, and Financial Performance

| | Exploratory innovation | | Exploitative | innovation | Financial performance | | |
|--|------------------------|----------|--------------|------------|-----------------------|----------|--|
| | Model 1 | Model 2 | Model 3 | Model 4 | Model 5 | Model 6 | |
| Unit size | -0.26*** | -0.24*** | -0.02 | 0.03 | 0.04 | 0.04 | |
| Branch size | 0.39*** | 0.35*** | 0.05 | 0.02 | 0.11 | 0.08 | |
| Unit age | -0.04 | -0.09 | -0.06 | -0.10 | -0.08 | -0.05 | |
| Functional diversity | 0.14* | 0.15* | -0.03 | -0.03 | 0.05 | 0.02 | |
| Unit client focus | 0.06 | 0.03 | -0.10 | -0.06 | 0.24*** | 0.27*** | |
| Unit past performance | 0.15* | 0.13* | -0.05 | -0.05 | 0.49*** | 0.49*** | |
| Branch past performance | 0.06 | 0.05 | 0.07 | 0.06 | 0.10* | 0.10* | |
| Environmental dynamism | | | | | 0.04 | 0.12* | |
| Environmental competitiveness | | | | | -0.05 | -0.09 | |
| Exploratory innovation | | | | | 0.02 | 0.02 | |
| Exploitative innovation | | | | | 0.09 | 0.03 | |
| Organizational antecedents | | | | | | | |
| Centralization of decision making, H1(a)/(b) | | -0.17** | | 0.04 | | | |
| Formalization, H2(a)/(b) | | -0.07 | | 0.18** | | | |
| Connectedness, H3(a)/(b) | | 0.20** | | 0.21** | | | |
| Connectedness squared | | -0.08 | | | | | |
| Interaction effects | | | | | | | |
| Exploratory innovation * environmental dynamism, H4(a) | | | | | | 0.15** | |
| Exploitative innovation * environmental dynamism, H4(b) | | | | | | -0.23*** | |
| Exploratory innovation * environmental competitiveness, H5(a) | | | | | | -0.05 | |
| Exploitative innovation * environmental competitiveness, H5(b) | | | | | | 0.19*** | |
| R^2 | 0.16*** | 0.26*** | 0.03 | 0.10** | 0.39*** | 0.47*** | |
| ΔR^2 | | 0.10*** | | 0.07*** | | 0.08*** | |

Note. Standardized regression coefficients are reported.

The baseline models (Models 1, 3, and 5) contain control variables. Models 2 and 4 introduce organizational antecedents of a unit's exploratory and exploitative innovation, and Model 6 examines moderating effects of environmental dynamism and competitiveness on a unit's financial performance.

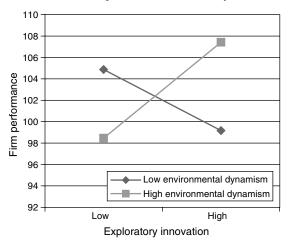
Regarding the effects of centralization of decision making on exploratory and exploitative innovation, Model 2 shows that the coefficient for exploratory innovation is negative and significant ($\beta = -0.17$, p < 0.01). Hypothesis 1(a) is supported. Model 4 shows that the coefficient for exploitative innovation is positive but not significant ($\beta = 0.04$, ns), thus not supporting Hypothesis 1(b). Although centralization decreases the ability of organizational units to pursue exploratory innovation, it does not support a unit's exploitative innovations as predicted. Regarding formalization, results in Model 2 show that formalization does not decrease a unit's exploratory innovation. Although the coefficient is negative, it is not significant ($\beta = -0.07$, ns), thereby not supporting Hypothesis 2(a). Hypothesis 2(b) that proposed a positive relationship between formalization and a unit's exploitative innovation is supported ($\beta = 0.18$, p <0.01). Thus, our findings indicate that formalization

enhances a unit's ability to pursue exploitative innovation. Regarding social relations in organizational units, we predicted an inverted U-shaped relationship between connectedness and exploratory innovation. As shown in Model 2, the coefficient for connectedness is positive and significant ($\beta = 0.20$, p < 0.01). However, the coefficient for the squared term is negative and not significant ($\beta = -0.08$, p > 0.10). Accordingly, the relationship between connectedness and exploratory innovation is positive rather than curvilinear, thereby not supporting Hypothesis 3(a). As shown in Model 4, the coefficient for connectedness and exploitative innovation is positive and significant ($\beta = 0.21$, p < 0.01), supporting Hypothesis 3(b). Overall, these findings suggest that densely connected social relations within organizational units positively influence the ability to develop exploratory innovation as well as exploitative innovation.

Regarding the moderating effect of environmental dynamism, Model 6 shows that the interaction between exploratory innovation and environmental dynamism is positive and significant ($\beta = 0.15$, p < 0.01). Hypothesis 4(a) is supported. To plot this interaction, exploratory innovation and environmental dynamism took the values of one standard deviation below (i.e.,

^{*}p < 0.05, **p < 0.01, ***p < 0.001.

Figure 1 The Moderating Effect of Environmental Dynamism



low level) and above (i.e., high level) the mean. The plot of the interaction is shown in Figure 1. Consistent with Hypothesis 4(a), Figure 1 shows a positive relationship between exploratory innovation and financial performance when environmental dynamism is high. Moreover, it also reveals that organizational units pursuing exploratory innovation in stable environments (i.e., low level of environmental dynamism) decrease their financial performance. As shown in Model 6, the coefficient for the interaction between exploitative innovation and environmental dynamism is negative and significant ($\beta = -0.23$, p < 0.001) as proposed by Hypothesis 4(b). Consistently, the plot of this interaction in Figure 2 shows a negative relationship between exploitative innovation and financial performance when environmental dynamism is high. Moreover, this figure also suggests that the more organizational units pursue exploitative innovation in stable environments (i.e., low level of environmental dynamism), the more they increase their financial performance.

Figure 2 The Moderating Effect of Environmental Dynamism

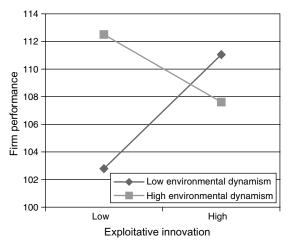
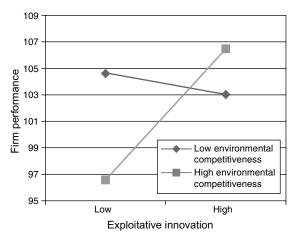


Figure 3 The Moderating Effect of Environmental Competitiveness



As shown in Model 6, the interaction between exploratory innovation and environmental competitiveness does not decrease financial performance ($\beta = -0.05$, p > 0.10). Although the coefficient is negative, it is not significant, thus, Hypothesis 5(a) is not supported. As predicted by Hypothesis 5(b), the interaction effect between exploitative innovation and environmental competitiveness is positive and significant ($\beta = 0.19$, p < 0.001). Thus, as plotted in Figure 3, organizational units pursuing exploitative innovation in highly competitive environments increase their financial performance.

Discussion and Conclusion

Research on exploration and exploitation is burgeoning, yet our understanding of the antecedents and consequences of both activities remains rather unclear. Although prior research has suggested that organizational antecedents differentially affect exploratory and exploitative innovations, empirical examinations have produced mixed results. Moreover, empirical studies have only started exploring the moderating role of the external environment on the effectiveness of exploratory and exploitative innovation. Focusing on organizational units, the objective of this study was to explore how organizations coordinate the development of exploratory and exploitative innovation in organizational units and successfully respond to multiple environmental conditions.

Our study underscores previous conceptual assertions that formal hierarchical structure, i.e., centralization and formalization, differentially influences exploratory and exploitative innovation (e.g., Benner and Tushman 2003). Centralization has been studied widely in innovation literatures and is supposed to negatively influence innovativeness (e.g., Damanpour 1991), however, the relationship between centralization of decision making and different types

of innovation remains rather unclear (Cardinal 2001, Damanpour 1991, Dewar and Dutton 1986). Our findings demonstrate that centralization negatively influences a unit's exploratory innovation. Accordingly, it reduces nonroutine problem solving and the likelihood that unit members seek innovative and new exploratory solutions (Atuahene-Gima 2003). Although centralization negatively influences exploratory innovation, it does not support exploitative innovation as predicted. Whereas Cardinal's (2001) research in the pharmaceutical industry revealed that centralization facilitated drug enhancement through exploitation of knowledge sources, our study found no support for such a hypothesized positive effect of centralization. A possible explanation for the insignificant relationship between centralization and exploitative innovation could be that in our research context—the financial services industry—decentralization of decision authority may be required to execute tasks and initiate ideas for improving existing products and services or enhancing customer service quality (Kirkman and Rosen 1999). To fully understand this relationship, future research may examine whether additional characteristics of innovations activities, such as uncertainty (Cardinal 2001), vary across industries and moderate the relationship between centralization and exploitative innovation.

With regard to formalization, we found a positive relationship between the extent of rules and procedures within organizational units and exploitative innovation. This observation reinforces the notion that rules and procedures are established to incrementally improve processes and outputs (Benner and Tushman 2003, Daft and Lengel 1986). Formalization makes existing knowledge and skills explicit and accelerates the diffusion of best practices within units (Zander and Kogut 1995). Regarding exploratory innovation, our findings did not provide support for the predicted negative effect of formalization on a unit's exploratory innovation. In this way, our study bears similarities with recent insights that rules and procedures might not be as detrimental to exploration efforts as previously assumed. Adler and Borys (1996), for instance, argue that well-designed rules and procedures enable employees to better master their tasks and functions. Moreover, codification efforts of newly developed knowledge in written rules and procedures might help units to facilitate the replication and diffusion of an exploratory innovation (Zollo and Winter 2002). In this sense, formalization does not simply produce inertial forces and a focus toward exploitation (e.g., Cardinal 2001), although its effect is contingent on its design and its ability to produce an enabling rather than a coercive bureaucracy (Adler and Borys 1996).

Our findings reveal that dense social relations within units are an effective coordination mechanism that yields multiple benefits. First, connectedness shows a significant positive effect on both exploratory and exploitative innovation. These results highlight the importance of social relations manifested in organizational units to pursue both exploratory and exploitative innovation. Subramanian and Youndt (2005), for instance, found that a firm's social capital enables its capability to develop incremental and radical innovations. Our results suggest that managers may develop densely connected social relations within their units to increase a unit's contextual ambidexterity, i.e., its ability to simultaneously pursue both types of innovations (Gibson and Birkinshaw 2004). Second, a comparison of the full model with restricted models containing either formal or informal coordination mechanisms (cf., Hansen and Wernerfelt 1989, Kotha and Nair 1995) also shows that informal coordination mechanisms (i.e., connectedness) are more important than formal coordination mechanisms (centralization and formalization) in predicting both types of innovation. Accordingly, our study indicates that informal coordination mechanisms not only contribute to pursuing exploratory and exploitative innovations, but are also more important than formal coordination mechanisms for developing either exploratory or exploitative innovation.

Prior research has argued that the nature of the external environment has an important role in the effectiveness of types of innovation (Zahra 1996, Zahra and Bogner 1999). Our findings provide substantial support for such environmental moderators. They provide various managerial implications regarding how organizational units successfully cope with various pressures from external environments. Specifically, results suggest that organizational units operating in more dynamic environments increase their financial performance by pursuing exploratory innovations. They resist the threat of obsolescence of their competences not only by developing new products and services (e.g., Zahra and Bogner 1999), but also by entering new markets and finding new customers. On the other hand, efforts of organizational units to respond to environmental changes through exploitation of existing products, services, and markets appear to have a negative effect on financial performance. These organizational units fall behind as they try to improve and extend existing products and services for markets that are in decline (Leonard-Barton 1992, Levinthal and March 1993, Sorensen and Stuart 2000). Hence, the empirical findings contribute to previous literatures by revealing that environmental dynamism differentially moderates the effectiveness of exploratory and exploitative innovations.

Contrary to our prediction, pursuing exploratory innovations in competitive environments does not significantly decrease financial performance. Although exploratory innovations decrease a unit's slack (Zahra 1996), they may establish new ways of generating above-normal returns. A possible explanation for the deviant finding could be that duration of environmental competitiveness plays a role. During long-term competitive rivalry, for instance, organizational units may find themselves trapped in endless improvement of existing products, services, and processes (Levinthal and March 1993). The only way to refrain from decreasing margins may be to develop radically new products and services for emerging markets or customers. Thus, although pursuing exploratory innovations might be detrimental, on average, during short periods of competitive rivalry, it might be the only way to establish new markets during long periods of competitive rivalry (Levinthal and March 1993). To further investigate the moderating role of environmental competitiveness, future research should include a measurement of the duration of environmental competitiveness. As predicted, empirical results show that organizational units that pursue exploitative innovations in highly competitive environments improve their performance. Hence, units are able to successfully operate in highly competitive environments by expanding current products and services and defending existing markets through increasing customer loyalty.

Limitations and Future Research Directions

Various limitations, which provide meaningful directions for future research, merit discussion. First, although the collection of performance data through internal corporate records and the temporary separation of the independent and dependent measures provide valuable methodological contributions, the issues of common method bias and unobserved heterogeneity cannot be totally ruled out. However, the inclusion of several relevant control variables, Harman's one-factor analysis, and the differential effects of study variables found on both types of innovation reduced our concerns. Nevertheless, future research may consider a longitudinal research design to better assess how organizational antecedents affect exploratory and exploitative innovation over time.

Second, new scales for exploratory and exploitative innovation were developed. Although we conducted several additional analyses to assess the validity of these measurements, it would be useful to measure both types of innovation using complementary measurements and relate these to our measurements. Future research may also provide a more-detailed examination of organizational antecedents as well as outcomes of new-to-unit versus new-to-market innovations.

Third, because our study focuses on the structural dimension of social networks, future research may examine the impact of the relational dimension of social networks. Relational embeddedness, or the strength of social relations between unit members, has been shown to increase the exchange of knowledge (Dhanaraj et al. 2004, Hansen 2002), which might impact the ability of units to pursue exploratory and exploitative innovations.

Fourth, our survey research was conducted at multiple organizational units in autonomous branches of a large financial services firm. Our focus helped to control for corporate-, industry- and country-specific differences that might have otherwise masked significant effects. Empirical studies in a wider variety of organizations within nonservice industries are necessary to generalize the findings further.

Fifth, our empirical study included performance data up to one year after the measurement of exploratory and exploitative innovations. Future studies may benefit from gathering performance data that span more than one year. Moreover, it would enable analyzing performance implications at different points in time to contrast the effects of exploratory and exploitative innovations. Future studies may also examine other dimensions of a unit's performance, such as sales growth and market share.

Sixth, although our study provides new insights into organizational antecedents and consequences of exploratory and exploitative innovation, it does not address how unit managers are triggered to change levels of exploratory and exploitative innovation. It would be useful to conduct in-depth studies to better understand how change efforts initiate.

All in all, our study highlights various theoretical and managerial implications through providing new insights into levers for increasing levels of exploratory and exploitative innovation. In response to the plea for developing and synchronizing both types of innovation, our study not only examines how ambidextrous organizations might successfully coordinate exploratory and exploitative innovation in organizational units, but also reveals under which environmental conditions both are effective.

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Appendix. Measures and Items at the Organizational Unit Level*

Exploratory innovation

Our unit accepts demands that go beyond existing products and services.

We invent new products and services.

We experiment with new products and services in our local market.

We commercialize products and services that are completely new to our unit.

We frequently utilize new opportunities in new markets. Our unit regularly uses new distribution channels.

We regularly search for and approach new clients in new markets.**

Exploitative innovation

We frequently refine the provision of existing products and services.

We regularly implement small adaptations to existing products and services.

We introduce improved, but existing products and services for our local market.

We improve our provision's efficiency of products and services.

We increase economies of scales in existing markets.

Our unit expands services for existing clients.

Lowering costs of internal processes is an important objective.**

Centralization of decision making

(Hage and Aiken 1967, Dewar et al. 1980)

There can be little action taken here until a supervisor approves a decision.

A person who wants to make his own decisions would be quickly discouraged.

Even small matters have to be referred to someone higher up for a final decision.

Unit members need to ask their supervisor before they do almost anything.

Most decisions people make here have to have their supervisor's approval.

Formalization

(Desphande and Zaltman 1982)

Whatever situation arises, written procedures are available for dealing with it.

Rules and procedures occupy a central place in the organizational unit.

Written records are kept of everyone's performance.

Employees in our organizational unit are hardly checked for rule violations.***

Written job descriptions are formulated for positions at all levels in the organizational unit.

Connectedness

(Jaworski and Kohli 1993)

In our organizational unit, there is ample opportunity for informal "hall talk" among employees.

In this unit, employees from different departments feel comfortable calling each other when the need arises.

Managers discourage employees discussing work-related matters with those who are not immediate superiors.***

People around here are quite accessible to each other.

In this organizational unit, it is easy to talk with virtually anyone you need to, regardless of rank or position.

Environmental dynamism

(Dill 1958, Volberda and Van Bruggen 1997)

Environmental changes in our local market are intense.

Our clients regularly ask for new products and services. In our local market, changes are taking place continu-

In a year, nothing has changed in our market.***

In our market, the volumes of products and services to be delivered change fast and often.

Environmental competitiveness

(Birkinshaw et al. 1998, Jaworski and Kohli 1993)

Competition in our local market is intense.

Our organizational unit has relatively strong competitors. Competition in our local market is extremely high.

Price competition is a hallmark of our local market.

*All items were measured on a seven-point scale, anchored by 1 = strongly disagree and 7 = strongly agree. **Item deleted after exploratory factor analysis; ***reversed item.

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