# Engineers Seeking Knowledge: The Effect of Control Systems on the Accessibility of Tacit and Codified Knowledge

3 Cristina Poleacovschi, PhD, Assistant Professor, Iowa State University, Town Engineering
4 Building, 394 Town Engineering, Ames, IA 50011, poleacov@iastate.edu, Corresponding author

5 Amy Javernick-Will, PhD, Associate Professor, University of Colorado Boulder, UCB 428, ECOT

6 512, Boulder, CO, 80309-0428, amy.javernick@colorado.edu

7 Tony Tong, PhD, Professor, University of Colorado Boulder, 995 Regent Drive, Koelbel 401, 419

8 UCB, Boulder, CO 80309-0419, tony.tong@colorado.edu

9 John Wanberg, PhD, Knowledge Strategy Management, Stantec, 1560 Broadway #1800, Denver,
10 CO 80202, john.wanberg@stantec.com

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# 12 Abstract

13 Engineering and construction organizations realize that knowledge sharing between 14 employees is essential to be competitive, yet few understand how knowledge sharing is affected 15 by management choices. This paper examines how managerial control systems, the structures and 16 routines used to influence organizational activities, influence knowledge accessibility, defined as 17 the effort that one takes to request and access knowledge from another person. Specifically, this 18 research examines and compares the effects of clan and bureaucratic control on the accessibility 19 of tacit versus codified knowledge. The researchers propose that individuals who perceive greater 20 clan control, or governance through common values and beliefs, will perceive greater accessibility 21 of both tacit and codified knowledge; while individuals who perceive greater bureaucratic control, 22 or governance through rules and procedures, will perceive increase in codified knowledge only.

To test the role of alignment between control systems and knowledge types in affecting knowledge accessibility, a questionnaire was administered to all engineers located in North America (855 people) within one engineering organization, and data collected from 298 responses were analyzed using linear regression analysis. The results in this research improve our understanding of knowledge accessibility and is an important step toward integrating control systems, knowledge type and knowledge accessibility.

#### 29 Introduction

30 The Engineering Procurement and Construction (EPC) industry is primarily knowledge-31 based, which means that the competitive advantage of organizations is significantly determined by 32 how effective organizations are at knowledge sharing. For example, to meet client needs, engineers 33 seek knowledge from each other when they encounter design challenges, take an unfamiliar 34 technical approach, or need someone to collaborate with them to solve a problem (Robinson 2010). 35 However, while practitioners acknowledge the critical nature of knowledge sharing for the success 36 of the organization, it is not readily apparent how organizations can govern knowledge sharing in 37 a way that best benefits project teams. Many organizations have focused on tools and knowledge 38 management systems that attempt to capture knowledge; but many of these systems, lessons 39 learned databases, and skills matrices fail to achieve their intent in practice (Storey and Barnett 40 2000). As a result, additional work is needed to determine how organizations can facilitate 41 knowledge sharing. To address this need, this research analyzes how control systems, the formal 42 and informal structures and routines used to influence organizational activities (Long et al. 2002), 43 affect perceptions of knowledge accessibility, or the effort that one takes to request and access 44 knowledge from another person (Woudstra et al. 2012). Knowledge accessibility is the initial step 45 in knowledge sharing, and is essential in project teams where engineers must access knowledge

quickly from their peers to meet project deadlines (Poleacovschi et al. 2017). Past work has
acknowledged the importance of knowledge accessibility by showing that teams and individuals
who have higher knowledge accessibility were more likely to have increased project and individual
performance (Cross and Cummings 2004; Haas 2006; Poleacovschi and Javernick-Will 2016).

50 While literature has increased focus on the mechanisms facilitating knowledge sharing and 51 knowledge accessibility (e.g., Hertzum 2014; Javernick-Will 2012; Wanberg et al. 2015), there 52 has been little work that investigates how the control systems initiated by management influence 53 an employee's ability to find and access knowledge needed to complete their projects. Managers 54 within EPC organizations adopt different control systems to influence individual behavior in a way 55 that best aligns with project and organizational goals (Tuuli et al. 2010a). Two forms of control 56 systems-clan and bureaucratic control- have been identified as distinct and critical systems to 57 govern individual behavior (Ouchi 1980). Clan control emphasizes the collective and, as a result, 58 values collaboration to achieve individual goals. In contrast, the management within bureaucratic 59 control systems monitors if employees follow the rules and procedures during their work (Long et 60 al. 2002). Both control systems operate through mechanisms or methods by which individual 61 action is governed (Cardinal et al. 2004). For instance, clan control relies upon common values, 62 traditions and beliefs, while bureaucratic control relies upon rules, standards and formal procedures to complete work (Ouchi 1980). We theorize that control systems will influence 63 knowledge accessibility as they affect individuals' motivation in the process of knowledge 64 65 seeking. However, the relationship will also depend on the knowledge type. One of the most important differentiating characteristics of knowledge is whether the knowledge is tacit or explicit 66 67 (Levin and Cross 2004; Nonaka 1994; Polanyi 1967). Tacit knowledge is knowledge that is 68 difficult to articulate in writing and can be explained easier through verbal and social interactions

69 (Polanyi 1967). Conversely, codified knowledge can be easily written down and does not 70 necessarily require social interactions for transferring (Polanyi 1967). Because knowledge applied 71 in EPC organizations can be both codified and tacit, the overall goal of the research is to contrast 72 the effects of clan and bureaucratic control on the accessibility of tacit and codified knowledge.

The research uses survey data and linear regression analysis to test whether clan and bureaucratic control increases accessibility of tacit and codified knowledge. We administered the survey questionnaire to 855 engineers located in North America within one EPC organization, and analyzed responses using linear regression analysis for knowledge accessibility and control systems. Based upon the 298 responses received, we show that increased clan control is positively associated with accessibility of tacit and codified knowledge, while bureaucratic control is positively associated with accessibility of codified knowledge only.

# 80 Literature Review

81 This work falls at the intersection of control systems, knowledge accessibility, and 82 knowledge type, which are reviewed briefly below before developing the hypotheses.

# 83 Control Systems

84 The concept of control systems was proposed by Ouchi (1980) to describe how 85 organizational control mechanisms manage individual behavior. The bureaucratic and clan 86 systems are two distinct and important control mechanisms in EPC organizations (Tuuli et al. 87 2010a; b). Bureaucratic control encourages employees to follow organizational and management 88 procedures to access knowledge from others in the organization. This approach emphasizes 89 structure and rules of the management (Lam 2000; Weber et al. 1958). In bureaucracies, seekers 90 tend to work according to formal organizational charts and procedures. Thus, bureaucratic control 91 emphasizes the importance of documentation, reporting, and standardization as ways of executing

92 everyday work. In contrast, clans are groups of people who have common understanding, values, 93 and beliefs. In clans, collaboration, reciprocity and common understanding become the norm 94 among team members (Kirsch et al. 2009). Individuals work towards a common goal, which 95 becomes an individual value. A culture of collaborative work de-emphasizes a hierarchy of actors 96 and emphasizes the importance of the parts (people) to the whole (project). In EPC organizations, 97 both control mechanisms are used to influence individual behavior, although managers choose to 98 use bureaucratic control mechanisms more frequently than clan control (Tuuli et al. 2010b; a). 99 Because control systems cannot be disconnected from individual behavior and motivation (Foss et 100 al. 2010; Grandori 1997; Turner and Makhija 2006), the research presented in this paper studies 101 how control systems influence knowledge accessibility.

## 102 Knowledge Accessibility

103 Past research on knowledge accessibility has primarily focused on the antecedents of 104 knowledge accessibility between two individuals. This work has shown that accessibility is 105 influenced by individual attributes (e.g. gender, tenure, hierarchy level) (Borgatti and Cross 2003) 106 and dyadic attributes, or attributes regarding the relationship between the knowledge seeker and 107 knowledge provider (Hertzum 2014; Vancouver and Morrison 1995). For instance, men were 108 likely to perceive decreased knowledge accessibility compared to women (Lee 2000); and 109 relationship quality (Vancouver and Morrison 1995), tie strength (Levin and Cross 2004) and trust 110 (Abrams et al. 2003; Levin and Cross 2004) were found to be important, as people who have close 111 relationships can communicate and access knowledge easily. While individual- and dyad- level 112 attributes are essential, this research addresses another important factor – control systems 113 implemented by management – to determine the influence of managerial control systems on 114 knowledge accessibility among employees.

115 Building on previous research, Woudstra et al. (2012) proposed an integrative framework 116 to define and measure accessibility based upon the social, cognitive and physical effort that people 117 take when seeking for knowledge. Social effort represents the level of psychological comfort that 118 people experience when interacting with the knowledge source. For instance, an engineer may 119 perceive decreased accessibility with a provider because he or she does not want to reveal his/her 120 lack of knowledge to the provider. Cognitive effort refers to the effort that arises based on people 121 who speak different professional languages or who have a different perspective of the project work, 122 requiring additional time to interpret their expertise. Cognitive effort can occur between two 123 engineers who have different technical expertise because they speak different professional 124 language. Physical effort is important for accessibility based upon the potential inconvenience that 125 occurs as a result of accessing knowledge from people who are located in different locations and 126 time zones. For instance, two engineers who work virtually may exert additional effort to 127 communicate compared to two engineers who work in the same office location. The framework is 128 theoretically and analytically suitable for the concept of knowledge accessibility, as it examines 129 the different forces that may influence people's desire to approach other people for knowledge.

# 130 Knowledge Type

Knowledge type influences the ways employees interact to access and obtain needed knowledge. The most common knowledge type emphasized in the literature is tacit and codified knowledge (Kogut and Zander 1996; Lam 2000; Nonaka and von Krogh 2009; Polanyi 1967; Su and Contractor 2011). Tacit knowledge is knowledge that is contextual, requiring rich descriptions of the problem's context and ease of communication between the knowledge seeker and provider. Tacit knowledge is frequently used within project-based organizations where project members need to share complex knowledge and create innovative solutions to project details. Codified knowledge is also important in the context of EPC organizations, as quality control processes andchecklists are often needed to ensure compliance with professional standards and codes.

140 Because of the importance of the two characteristics of knowledge for everyday 141 construction engineering tasks, previous work identified the antecedents of transferring tacit and 142 codified knowledge (Hansen 1999; Holste and Fields 2010; Levin and Cross 2004). For instance, 143 Hansen (1999) showed that transferring tacit knowledge requires strong ties, or connections that 144 have frequent interactions, while codified knowledge can be transferred using weak ties, or 145 connections that have less frequent interactions. Holste and Fields (2010) have shown that 146 individuals need to build trust in order to easily share tacit knowledge. Nevertheless, these studies 147 have primarily focused on the relational and individual level antecedents of seeking and 148 transferring knowledge, leaving the effect of control systems on knowledge accessibility 149 understudied.

#### 150 Hypotheses Development

151 The study of control systems on accessibility is primarily rooted in studies researching the 152 fit between control systems and organizational outcomes. While not directly using the term 153 "accessibility", the accessibility of knowledge is implied in this past work when using the term 154 "fit" and "alignment" (Lam 2000; Osterloh and Frey 2000; Turner and Makhija 2006). For 155 instance, scholars identified the alignment between control systems and the dominant knowledge 156 type (tacit or codified) that described the work conducted by the organization (Lam 2000; Osterloh 157 and Frey 2000; Turner and Makhija 2006). It was theorized that clans would be appropriate for the 158 accessibility of tacit knowledge, while bureaucratic control would be the best fit for the 159 accessibility of codified knowledge (Lam 2000; Osterloh and Frey 2000; Turner and Makhija 160 2006). In other words, if the complexity of a construction project is reduced to more specialized

and repetitive work, or codified knowledge, then the management could adopt a bureaucratic approach with increased rules and procedures. However, this past work did not empirically evaluate the effects of control systems on knowledge accessibility at the dyad level.

164 Bureaucratic control encourages employees to follow organizational and management 165 procedures to access knowledge from others in the organization. Within bureaucracies, individuals 166 may have autonomy, but they have more difficulty transferring tacit knowledge with others due to 167 the increased formality of the working processes (Lam 2000). Specifically, tacit knowledge is more 168 difficult to transfer as it is often context-specific and requires close social relationships and 169 frequent communication with the knowledge provider. For instance, Levin and Cross (2004) have 170 shown that people need to trust the knowledge provider in order to seek knowledge from them. In 171 bureaucracies, seekers tend to work according to formal organizational charts and procedures, 172 which may not facilitate verbal and *ad hoc* conversations necessary for accessing and transferring 173 tacit knowledge. Thus, bureaucracies advantage formality and create communication channels that 174 allow the easy transfer of knowledge that is written, or codified, such as standards and codes. As 175 such, we expect that knowledge seekers will perceive increased accessibility of codified 176 knowledge.

*Hypothesis 1:* Bureaucratic control will be positively associated with accessibility of codified
knowledge but not tacit knowledge.

In clans, collaboration becomes the norm among team members who seek to function based on trust and reciprocity (Kirsch et al. 2009). Within clans, individuals will value other employees' expertise and provide their knowledge to whomever needs it, rather than relying on formal hierarchical or social positions. This is expected to increase the accessibility of knowledge. Specifically, we expect tacit knowledge to be accessed easily due to increased social interactions within clans. Similarly, we expect that the accessibility of codified knowledge will also be increased among clans, as the transfer of codified knowledge requires minimal effort given the well-established communication channels present in clans. As a result, we can expect that in an environment in which clan control is enhanced, knowledge accessibility of both tacit and codified knowledge will increase.

*Hypothesis 2:* Clan control will be positively associated with accessibility of tacit and codified *knowledge*.

# 191 Methods

192 The context of this research is one large EPC organization. The organization focuses 193 primarily on providing design and construction services in water and wastewater.

# 194 Data Collection

Initially, a pilot survey was sent to a random sample of 50 employees at the organization to validate the clarity of the survey questions and to check the reliability of the measures for key variables (knowledge accessibility, control systems). Based upon the feedback received, the order of the survey questions was rearranged from two sections into three sections, allowing respondents to reflect between sections. The Cronbach's alpha for the items for measuring variables of knowledge accessibility and control systems was always above 0.7, which validated the use of the items for the final survey.

The final survey was administered to 855 employees in the company who represented the entire group of technical employees (e.g. engineers, architects, scientists) in the North America region. 298 valid responses were returned, representing a survey response rate of 34.8%. In the questionnaire, individuals were asked to identify two people from the organization whom they sought knowledge from (Borgatti and Cross 2003; Cross and Cummings 2004): "*During our work*,

207 we sometimes encounter problems we do not know how to solve and need additional information 208 and advice. Please identify two people at [the company] that you have approached for information 209 or advice to solve a problem." Afterwards, the respondents were asked to evaluate knowledge 210 accessibility, attributes of the knowledge provider and themselves (the knowledge seeker), and to 211 rate the level of clan and bureaucratic control employed by their managers. The unit of analysis of 212 the independent variable represents the respondent's assessment of clan and bureaucratic control, 213 and the unit of analysis of the dependent variable represents the accessibility of the knowledge 214 providers. 41 respondents rated only one provider, but these respondents' answers were included 215 in the empirical analysis for completeness. As a result, the analyses in this paper is based on 555 216 dyads.

- 217 Variables and Measurement
- 218 Dependent Variable

219 Our dependent variable is Knowledge accessibility. Woudstra et al. (2012) proposed a 220 three-item framework to measure knowledge accessibility, defined as the effort, including 221 physical, cognitive and social, that one takes to ask and request knowledge from another person. 222 Drawing on Woudstra et al.'s (2012) framework, the following eight items were used to measure 223 accessibility: 1. This person's information and advice is easy to comprehend and use (Anderson 224 et al. 2001); 2. The person's information and advice is easy to understand (Xu et al. 2006); 3. I feel comfortable approaching this person (Morrison and Vancouver 2000); 4. I feel nervous 225 226 approaching this person (Xu et al. 2006); 5. I do not feel comfortable revealing my lack of 227 knowledge to this person (Fidel and Green 2004); 6. I feel indebted to this person when asking 228 questions from them (Borgatti and Cross 2003); 7. Approaching this person takes significant 229 physical effort (adapted from Woudstra et al., 2012); 8. Approaching this person takes significant

*time* (adapted from Woudstra et al., 2012). Respondents were asked to assess the eight items based
on the following scale (from 1 to 5): "Strongly disagree, Disagree, Neither agree not disagree,
Agree, and Strongly agree." The dependent variable, *accessibility*, was calculated by averaging
the eight items. The Cronbach's alpha for the items was 0.78, which showed the reliability of the
items measuring accessibility.

# 235 <u>Independent Variables</u>

236 The two independent variables related to control systems (Bureaucratic control and Clan 237 *control*) were measured by following Long et al.'s (2011) approach. To measure the level of 238 bureaucratic control and clan control, respondents were asked to assess five items each using the 239 scale of "Strongly disagree, Disagree, Neither agree not disagree, Agree, and Strongly agree". 240 Specifically, for bureaucratic control, respondents were asked to assess the following five items, 241 where "X" represents the name of the connection indicated by the respondent: (1) X (supervisor) 242 primarily monitors how well I execute standardized rules and procedures when I do my work; (2) 243 X (supervisor) emphasizes the need for employees to follow rules and procedures in doing their 244 *job; (3) X (supervisor) rewards employees who accurately follow rules and procedures in doing* 245 their jobs. (4) Whether I succeed or not in this organization is largely determined by how well I 246 execute formal rules and procedures; (5) In doing my job, I spend most of my time executing rules 247 and procedures. For clan control, respondents were asked to assess the following five items: (1) X248 (supervisor) primarily monitors how well I get along with my co-workers; (2) X (supervisor) 249 emphasizes the need for employees to get along with each other; (3) X (supervisor) rewards 250 employees who get along well with their co-workers. (4) Whether I succeed or not in this 251 organization is largely determined by how well I get along with my co-workers. (5) In doing my 252 job, I spend most of my time collaborating with colleagues on work activities. Given that all items

were theorized to have equal weight in measuring control systems (Long et al. 2011), the two independent variables, *Bureaucratic control* and *Clan control*, were calculated as an average of the first set of five items, and the second set of five items, respectively.

256 Another independent variable, *Knowledge tacitness*, was measured by using three items 257 from Hansen (1999): (1) How much of the information/advice that came from X was explained to 258 you in writing (in written reports, manuals, e-mails, faxes, etc.) [None, Almost none, Less than 259 half, Half, More than half, Almost all, All]; (2) How well documented in writing, was the 260 information/advice that you received from X? Consider all the information or advice. [Not well 261 documented, Less documented, Somewhat less documented, Somewhat well documented, 262 Documented, Well documented, Very well documented]; (3) What type of information/advice came 263 from X? [7=mainly reports, manuals, documents; 4=half knowledge explained verbally, half 264 reports/documents; 1=mainly personal practical knowledge explained verbally]. The variable 265 *Knowledge tacitness* was calculated by averaging the three items.

266 <u>Control Variables</u>

Based on previous literature, the following variables were controlled for that may affectknowledge accessibility:

Similar age (*Sim\_age*): Respondents were asked to indicate their age in number of years.
 They were also asked if they were in the same age group as the knowledge provider (plus or minus 5 years). The variable was treated as dichotomous. It was coded as "1" while difference of age was coded as "0". This control variable was included since people of similar age may have similar ways of sharing knowledge (Sanaei et al. 2013).

Similar race (*Sim\_race*): Respondents were asked to identify their race (Hispanic or Latino,
 Black or African-American, White, Asian Pacific Islander, or Other) and if they were of

the same race as the knowledge provider. The variable was treated as dichotomous. It was
coded as "1" while difference of race was coded as "0". This control variable was included
because previous work has shown that similarity of race is essential to how people form
friendship relationships that may affect knowledge sharing (Mollica et al. 2003).

280 Similar expertise (Sim expertise): The primary area of expertise for the knowledge seeker 281 and provider was obtained from the database provided by the focal organization. The 282 database included areas of expertise in civil engineering, mechanical engineering, electrical 283 engineering, process engineering, environmental engineering, structural engineering, 284 architecture and construction. The variable was treated as dichotomous. It was coded as 285 "1" while difference in expertise was coded as "0". This control variable was included 286 because people with similar expertise have a good mutual understanding of their expertise, 287 facilitating their knowledge seeking (Borgatti and Cross 2003).

Similar hierarchy level (*Sim\_level*): A provider's hierarchical level was obtained by asking
 respondents to specify the provider's level in the hierarchy, in relation to the provider
 (*"He/she is the same hierarchy level; He/she is higher hierarchy level; He/she is in lower hierarchy level; or We do not work together"*). The variable was treated as dichotomous.
 It was coded as "1" while difference in level was coded as "0". This control variable was
 included because people seeking knowledge from providers in higher levels may not want
 to reveal their lack of knowledge to them.

Similarity of office location (*Sim\_location*). Respondents were asked if they worked in the same office location as the provider. The variable was treated as dichotomous. It was coded as "1" while difference in location was coded as "0". This control variable was included

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because people in the same location are likely to share and transfer knowledge morefrequently (Wanberg et al. 2015).

• Gender (*Seeker\_gender*) and similarity of gender (*Sim\_gender*). Previous work (Poleacovschi et al. 2017) showed that the knowledge seeker's gender (Lee 2002) and similarity in gender between the seeker and provider play an important role in knowledge seeking.

Tie strength (*Tie\_strength*): Respondents were asked to assess the frequency of interactions
 with providers using the following scale: "Once every 3 months - Once every 2 months Once a month - Twice a month - Once a week - Twice a week - Once a day". The measure
 for tie strength was taken from previous research (Hansen 1999; Levin and Cross 2004).
 The variable was coded on a continuous scale from 1 to 7. This control variable was
 included as past work has shown that knowledge accessibility increases with the frequency
 of communication (Hertzum 2014).

#### 311 Statistical Approach

312 Data were analyzed using linear regression analysis. To test the hypotheses on the effects 313 of Bureaucratic control (H1) and Clan control (H2) on the accessibility of codified and tacit 314 knowledge, respectively, the coefficient estimates of the two independent variables and their 315 significance levels were examined by performing subsample analysis, with the split of the full 316 sample at the mean value of Knowledge tacitness. This created a "Codified Knowledge 317 Subsample" where observations have a below-the-mean value of knowledge tacitness, as well as 318 a "Tacit Knowledge Subsample" where observations have an above-the-mean value of knowledge 319 tacitness. Subsample analysis is widely used for comparing coefficients between groups due to the 320 many advantages it offers (Greene 2008): subsample analysis does not require that unexplained

variances be identical between the two groups of firms, and it allows the effects of the right-handside covariates to differ between the groups, leading to consistent within-group estimates (Hoetker
2007).

324 In addition to comparing the signs and significance levels of the estimated coefficients on 325 Bureaucratic control and Clan control across the subsamples, another analysis was performed to 326 test the two hypotheses formally. Specifically, using the full sample (all observations), an 327 interaction term was created between an independent variable (Bureaucratic control or Clan 328 *control*) and a dummy variable (*Tacit subsample*) indicating whether a focal observation was in 329 the Tacit Knowledge Subsample (taking the value 1) or the Codified Knowledge Subsample 330 (taking the value 0). Regressions were run, and the sign and significance level of the estimated 331 coefficient on the interaction term was examined (Bureaucratic control \* Tacit sample, or Clan control \* Tacit sample). This approach provides a more formal test of whether the estimated 332 333 coefficient on Bureaucratic control (or Clan control) is significantly different between the two 334 subsamples.

### 335 **Results**

#### 336

Table 1 reports descriptive statistics for the variables.

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#### **Table 1: Descriptive Statistics**

	Number of Observations	Mean	Standard deviation	Min.	Max.
Accessibility	555	4.3	0.56	1.25	5.12
Sim_race	555	1.70	0.47	1	3
Sim_age	555	1.38	0.51	1	3
Sim gender	555	1.63	0.49	1	3
Sim location	555	1.59	0.53	1	3
Sim_level	555	1.13	0.34	1	2
Tie strength	555	5.17	1.74	1	7
Seeker gender	555	1.63	0.48	1	2
Bureaucratic control	555	3.23	0.69	1	5

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Clan control	555	3.30	0.57	1	5
Knowledge tacitness	555	4.60	1.21	1	7
Tacit subsample	555	0.53	0.50	0	1

339	Table 2 presents hypotheses testing results. Models 1-3 report results testing Hypothesis 1,
340	and Models 4-6 report results testing Hypothesis 2. Specifically, Models 1 and 4 are the Codified
341	Knowledge Subsample, Models 2 and 5 are the Tacit Knowledge Subsample, and Models 3 and 6
342	are the Full Sample with all observations.

# Table 2: Results for the Effects of Bureaucratic and Clan Controlon the Accessibility of Codified and Tacit Knowledge

	(1)	(2)	(3)	(4)	(5)	(6)
	Codified	Tacit	Full	Codified	Tacit	Full
	Knowledge Subsample	Knowledge Subsample	Sample	Knowledge Subsample	Knowledge Subsample	Sample
Sim_race	-0.052	-0.043	-0.040	-0.030	-0.020	-0.017
Sim_race	(0.070)	(0.074)	(0.050)	(0.070)	(0.074)	(0.051)
	(0.070)	(0.07.1)	(0.02.0)	(0.070)	(0.07.1)	(0.001)
Sim age	0.068	$0.177^{*}$	$0.115^{*}$	0.043	$0.175^{*}$	0.103*
_ 0	(0.064)	(0.073)	(0.048)	(0.063)	(0.072)	(0.047)
Sim_gender	0.116	0.144	$0.120^{*}$	0.109	0.142	$0.116^{*}$
	(0.077)	(0.092)	(0.059)	(0.076)	(0.091)	(0.058)
	0.000	0.000	0.072	0.042	0.000	0.072
Sim_location	-0.060	-0.080	-0.072	-0.043	-0.098	-0.072
	(0.073)	(0.074)	(0.052)	(0.072)	(0.074)	(0.052)
Sim level	-0.007	0.109	0.071	-0.029	0.142	0.081
	(0.107)	(0.098)	(0.072)	(0.106)	(0.098)	(0.072)
		()	(1 1 )			()
Tie_strength	0.035	$0.070^{**}$	$0.051^{**}$	0.041	$0.074^{**}$	$0.056^{***}$
	(0.022)	(0.023)	(0.016)	(0.022)	(0.023)	(0.016)
		*	**		,	**
Seeker_gender	-0.131	-0.233*	-0.179**	-0.122	$-0.233^4$	-0.175**
	(0.079)	(0.092)	(0.059)	(0.078)	(0.091)	(0.059)
	0.100*	0.0001	0.115*			
Bureaucratic control	$0.109^{*}$ (0.052)	-0.0001 (0.049)	$0.115^{*}$ (0.052)			
	(0.052)	(0.049)	(0.032)			
Tacit subsample			$0.398^{\dagger}$			0.186
ruen subsumpte			(0.230)			(0.278)
			(**)			()
Bureaucratic control			-0.119 <sup>†</sup>			
* Tacit subsample			(0.069)			
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Clan control				0.169 <sup>**</sup> (0.060)	0.130 <sup>*</sup> (0.059)	0.168 <sup>**</sup> (0.061)
Clan control * Tacit subsample						-0.051 (0.083)
Constant	3.876 <sup>***</sup> (0.293)	3.956 <sup>***</sup> (0.287)	3.707 <sup>***</sup> (0.239)	3.630 <sup>***</sup> (0.318)	3.448 <sup>***</sup> (0.329)	3.461 <sup>***</sup> (0.270)
Ν	260	295	555	260	295	555
$R^2$	0.049	0.077	0.058	0.062	0.093	0.070
F value	1.619	3.025	3.363	2.086	3.716	4.126

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Standard errors in parentheses. <sup>†</sup> p<0.10, <sup>\*</sup> p<0.05, <sup>\*\*</sup> p<0.01, <sup>\*\*\*</sup> p<0.001.

In Model 1, the coefficient on the variable Bureaucratic control is positive and significant 346 347 (p<0.05), suggesting that bureaucratic control is associated with increased accessibility of codified 348 knowledge. In Model 2, the coefficient on *Bureaucratic control* is not significant, thus bureaucratic 349 control is not associated with accessibility of tacit knowledge. Taken together, results in Models 1 350 and 2 provide support for our H1 that bureaucratic control will be positively related to the 351 accessibility of codified knowledge but not that of tacit knowledge. In Model 3, the coefficient on 352 the interaction term Bureaucratic control \* Tacit subsample is negative and modestly significant 353 (p<0.10), suggesting that the effect of bureaucratic control on tacit knowledge is significantly 354 different (lower) than its effect on codified knowledge. This result also validates the significantly 355 positive coefficient on Bureaucratic control in Model 1 (codified knowledge) but the insignificant 356 coefficient in Model 2 (tacit knowledge). Overall, results in Model 3 provide further support for 357 H1.

In Model 4, the coefficient on the variable *Clan control* is positive and significant (p<0.01), suggesting that clan control is associated with increased accessibility of codified knowledge. In Model 5, the coefficient on the variable *Clan control* is similarly positive and significant (p<0.05), thus clan control is also associated with increased accessibility of tacit knowledge. Taken together, results in Models 4 and 5 provide support for our H2 that clan control will be positively related to the accessibility of both codified and tacit knowledge. In Model 6, the coefficient on the interaction term *Clan control \* Tacit subsample* is not significant, suggesting that the effect of clan control on tacit knowledge is not significantly different than its effect on codified knowledge. This result is consistent with the finding earlier that the coefficient on *Clan control* is positively significant in both Model 4 (codified knowledge) and Model 5 (tacit knowledge), and that the size of the coefficient estimates (and standard errors) for *Clan control* in both models is relatively close to each other. Overall, results in Model 6 provide further support for H2.

#### 370 **Discussion**

371 This research sought to understand the influence of control systems (clan and bureaucratic 372 control) on knowledge accessibility based on knowledge types. The results showed that the effect 373 of clan control on accessibility was positive and significant for both tacit and codified knowledge. 374 This means that whenever respondents perceived clan control, they were likely to experience less 375 social, cognitive, and physical effort in accessing knowledge providers regardless of the type of 376 knowledge to seek. In contrast, bureaucratic control had a positive effect on the accessibility of 377 codified knowledge only, meaning that bureaucratic control is not systematically related to the 378 accessibility of tacit knowledge. While control systems have been shown to influence individual 379 behavior, existing literature has not yet studied the link between control systems and knowledge 380 sharing. This study is an important step toward integrating control systems, knowledge type and 381 knowledge accessibility at the dyad level. This research showed that, after controlling for relational 382 attributes (e.g. similarity of gender), the control mechanisms applied by management played an 383 important role on the accessibility of both tacit and codified knowledge. Specifically, people 384 perceived knowledge to be more accessible, regardless of knowledge type, whenever they 385 perceived a clan environment. The results contribute to literature on knowledge sharing and control 386 systems by analyzing the effect of two control systems and on the accessibility of tacit and codified 387 knowledge. As such, this research emphasizes the knowledge *context* as an important variable in 388 the relationship between control systems and knowledge accessibility (Agarwal et al. 2011; 389 Hertzum 2014). While existing work in construction and engineering has primarily focused on the 390 social relations and individual motivation as essential for knowledge sharing (Javernick-Will 2012; 391 Poleacovschi and Javernick-Will 2017; Sanaei et al. 2013), the findings from this research show 392 the importance of control effects on knowledge sharing, and emphasize inclusion of control 393 systems as an important variable in knowledge sharing behavior.

394 For practitioners, the link between control systems and knowledge accessibility presents 395 important managerial implications. Decisions of control systems should include thought regarding 396 the types of knowledge that employees need to access to complete their work. If their tasks are 397 complex and require them to access tacit knowledge, then clans would be more suited to enhance 398 knowledge accessibility. If the task can be completed based upon existing, codified knowledge 399 within the firm, then either clans or bureaucracies can be implemented. Nevertheless, project 400 managers should consider the costs of fostering bureaucratic and clan control. Employing clan 401 control is expected to be more expensive and time consuming due to socialization among clan 402 members and emotional labor to foster a clan identity. The costs should be especially considered 403 and compared in the case of codified knowledge which can be transferred using both control 404 systems.

405 Limitations and Future Work

406 As with any research, this research contains limitations. First, the assessment of control 407 systems represents the perceptions of the respondents. Future work can evaluate ways to measure 408 control systems using a more objective scale. Alternatively, the assessment of control systems can be validated through an inter-rater reliability rating, where several employees who have the same supervisors assess the control systems in the survey. Second, clan and bureaucratic control were included, but not market-based control, because monetary compensation has minimal influence on how people share and transfer knowledge (Javernick-Will 2012), and there is a lack of organizations that employ market-based control mechanisms. This work is based on the US market so that cultural differences in knowledge accessibility and control systems could be controlled for, which limits the generalizability of the findings.

### 416 **Conclusion**

417 In knowledge-based EPC organizations, knowledge accessibility is critical for employees 418 to complete their work effectively. While advances have been made in better understanding how 419 individual and dyadic attributes between a knowledge seeker and provider influence knowledge 420 accessibility, there has been a dearth of research that investigates how managerial control 421 mechanisms influence knowledge sharing and accessibility. Thus, the goal of this research was to 422 determine how different control systems-bureaucratic and clan-influenced knowledge 423 accessibility based on knowledge type. To achieve this goal, a survey was administered to 855 424 technical specialists (i.e., engineers, architects and scientists) within North American offices in an 425 engineering organization and linear regression analysis was used to validate the hypothesis that 426 clan control, or developing an environment supportive of collaboration, positively affected 427 accessibility of both tacit and codified knowledge. In contrast, bureaucratic control affected the 428 accessibility of codified knowledge only. Theoretically, this research improves understanding of 429 knowledge accessibility by showing the link between the control systems and knowledge 430 accessibility, and by specifying that the type of knowledge is important factor in this relationship. 431 Practically, project managers who want to increase accessibility among employees may foster one

- 432 of the control systems based on the nature of the project work. If the work requires frequent access
- 433 to tacit knowledge, then they should consider governing through clan control.

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