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Additional Information

### 1 UNDERSTANDING INTERACTIONS BETWEEN DESIGN TEAM MEMBERS OF

### 2 CONSTRUCTION PROJECTS USING SOCIAL NETWORK ANALYSIS

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### 6 Abstract

Social Network Analysis (SNA) has not been used to study design project teams in 7 which the full interactions have become more complex (formal and informal) because the 8 team members are from different companies and there is no collocation. This work 9 proposes a method to understand the interactions in the design teams of construction 10 projects using SNA metrics and the sociograms generated within temporary organizations. 11 This study includes three stages: (1) a literature review of the dimensions of interactions 12 within work teams and the application of SNA to the architecture, engineering and 13 construction (AEC) industry; (2) a proposal of an interaction network method for 14 construction project design teams; and (3) an analysis of a pilot project. Interaction 15 networks were defined in two categories: general interactions and commitment 16 management. For each network, metric indicators were defined for the analysis. The pilot 17 project showed high levels of consistency among team responses. The proposed method 18 allows an analysis of the entire work team and of each individual team member. The 19

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20 method also makes it possible to analyze the work team from a global perspective by21 carrying out a joint analysis of two or more networks.

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*Keywords*: interaction, interaction metrics, sociograms, information flow, design teams,
social networks

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#### 26 INTRODUCTION

The architecture, engineering and construction industry (AEC) is fragmented into several specialties that correspond to the different phases of a project (Dainty et al. 2001; Love et al. 2002). A high degree of fragmentation requires better interaction between the specialties (Ng and Tang 2010). The interaction of a work team is generated through communication, coordination and collaboration among the participants (Schöttle et al. 2014). This interaction can be represented as the information flow between the right people at the right time (Dave et al. 2014; Al Hattab and Hamzeh 2015).

Poor interactions in work teams can lead to poor performance, both in the implementation of each phase (design, construction, maintenance, operation and deconstruction) and globally in the life cycle of the project (Baiden et al. 2006). This phenomenon is particularly important at the design phase because decisions made at this phase can significantly affect the following phases, and the cost of making changes at this phase are insignificant compared with the cost of implementing changes in future phases (American Institute of Architects California Council 2007).

The client usually chooses a project coordinator or design manager at the design phase of a construction project to lead this phase and manage the interaction between all the specialists, such as architects, structural, electrical and sanitary specialists, and others (Knotten et al. 2017; Oluwatayo and Amole 2013). Because the AEC industry is
fragmented, the level of subcontracting of the specialties has been increasing in recent years
(Oviedo-Haito et al. 2014).

More fragmentation requires more interaction, which must be approached by 47 considering the social and technological factors. These factors together allow the 48 information flows to be suitable for the desired interaction. A project team with greater 49 interaction may generate an increase in trust and learning in work teams, achieving high 50 levels of commitment and understanding between the participants (Phelps 2012). Flores et 51 52 al. (2014) claim that by improving the interaction of information flows between people, improved project performance can be achieved. An interaction in a work team can be 53 represented as a network of commitments among its members, who establish reliable 54 commitments among themselves, to achieve the objectives of the project (Viana et al. 55 56 2011).

Evaluation of the interactions between members of a work team is challenging. One 57 approach to this issue is to measure teamwork with instruments; Valentine et al. (2015) 58 present a literature review from 2012 in which 39 instruments are identified for measuring 59 teamwork with surveys. Most of these instruments include dimensions such as 60 communication, coordination and respect. Although the study by Valentine et al. (2015) 61 62 includes a large number of instruments that evaluate teamwork, these instruments carry out a general evaluation of an organization and thus do not allow the identification of the 63 frequency and dimension of interaction that is generated between the people within the 64 organization who participated in the surveys. In addition, many of the instruments that 65 measure teamwork evaluate it from either an individual or a global perspective, but not 66 67 both (Paris et al. 2000).

A tool for assessing interaction from an individual and a global perspective simultaneously is Social Network Analysis (SNA), which has been used to evaluate the information flow in AEC industry organizations (Alarcón et al. 2013). SNA uses graph theory to explain the relationships that exist among a group of people based on mathematical metrics, such as the density, length and diameter of the network and other metrics (Marin and Wellman 2011).

There are studies evaluating the social networks in the AEC at an organizational or 74 company level (Castillo et al. 2018a; Segarra et al. 2017) or at the level of a construction 75 76 project (Castillo et al., 2018b) in which all the participants are from the same workplace. These studies use standard social network metrics for all the dimensions of interactions 77 without providing a specific interpretation for each network. In addition, such metrics are 78 applicable to large organizations, and they are difficult to interpret in small work teams, 79 such as temporary organizations created during the design phases of construction projects. 80 A large organization is defined as one that exceeds the limits of medium-sized companies 81 (250 people) and small companies (49 people) (European Commission 2003); however, it is 82 difficult to clearly define the size of a network to characterize it. Richards and Macindoe 83 (2010) propose that a small network is one with fewer than 100 members, while a large 84 network has more than 1000 nodes. Therefore, design project teams are small social 85 networks because the number of members is fewer than 50 people. According to a previous 86 report (Segarra et al. 2017), when a network is small, there is a greater possibility of 87 sharing important information because the network facilitates interaction among its 88 members. 89

90 Previous studies on social networks in the construction industry provide valuable 91 information mostly about large organizations (e.g., Flores et al. 2014) in construction

companies of more than 100 employees. However, there are fewer studies analyzing small 92 93 groups (fewer than 50 people); there are only preliminary studies of architecture (Segarra et al. 2017) and construction teams (Priven and Sacks 2013). In addition, these studies do not 94 95 include an evaluation of the interaction from the perspective of the commitment network 96 among the members of a team. SNA has been carried out in design teams with participants from different companies using information obtained from BIM log files that are registered 97 in collaborative design software (Zhang and Ashuri 2018); however, this methodology can 98 99 only be used in BIM design environments, and certain informal communicative actions typical of the design process are lost, such as telephone calls and face-to-face 100 conversations. 101

102 SNA has not been used to study design project teams in which the full interactions have become more complex (formal and informal) because the team members are from different 103 104 companies and noncollocation obstructs the information flow. Design teams play a very 105 important role because they create design concepts. During the design process, the teams adjust the client's requirements to the project before the planning phase (Oluwatayo and 106 107 Amole 2013). To perform this task, the design offices form multidisciplinary working groups within their own or with other organizations, and these groups are divided into task 108 teams (Sonnenwald 1996). This project approach has evolved from a tool-oriented 109 110 understanding of projects, in which it is compared with a production function that transforms inputs into outputs through mathematical formulation and planning (Turner and 111 Müller 2003), to a consideration of the project as a temporary organization (Sydow and 112 Braun 2018). In contrast to the social networks of construction companies, the social 113 networks in design offices are generally small and have greater change dynamics due to the 114 115 short duration of their production processes (Pryke 2012).

116 Considering this knowledge gap, this study proposes a method to understand different 117 dimensions of the interactions in construction project design teams through the analysis of 118 social network metrics and sociograms generated within these types of temporary 119 organizations, in which the members of the design teams are from different companies.

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### 121 RESEARCH METHODOLOGY

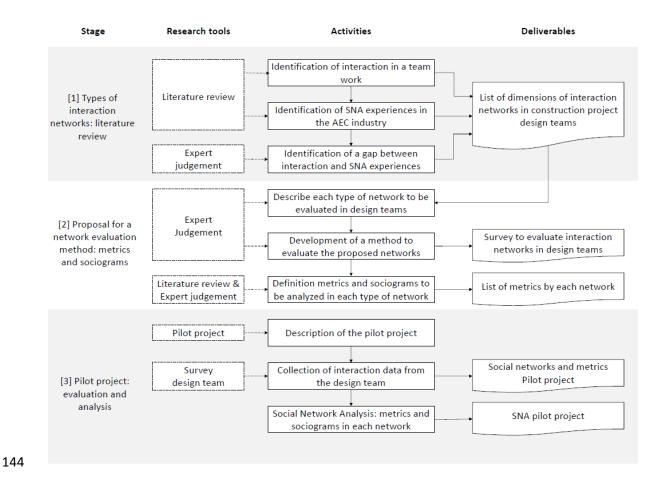
To achieve the objective of this work, the research was divided into three stages: (1) a literature review of the dimensions of interactions evaluated in the AEC industry and different experiences of SNA implementation, (2) a proposal for an interaction network method (measurement and analysis) for construction project design teams, and (3) an evaluation and analysis of a pilot project to exemplify the use of the tool. These stages are displayed in Fig. 1.

In the first stage, a literature review of specialized journals in engineering and 128 129 construction project management and of the proceedings of major conferences held between 2008 and 2019 was carried out. The search was carried out in the following online 130 131 libraries: Engineering Village, Web of Science and Scopus. The topics sought were interaction, teamwork, team effectiveness, SNA, team integration and team collaboration; 132 all the papers selected were from the AEC industry. This first review aimed to identify the 133 134 dimensions of teamwork, which can be defined as an interaction between two or more people in a design team. The literature review identified a perspective of the interaction of 135 work teams associated with the commitment network generated among them. Therefore, a 136 list of dimensions of interaction was compiled and grouped into two categories: traditional 137 interaction and commitment management. In addition, a review of the literature associated 138 139 with the use of SNA in the AEC industry was conducted. Some metrics and characteristics

of this type of analysis were presented, exemplifying different case studies reported in the
literature. Finally, the gap between the dimensions of the interactions associated with an
effective team and the use of SNA in the AEC industry was identified.

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### Fig. 1. Research methodology stages

In the second stage, the authors proposed a method to assess the interaction in a design team of a construction project, using the design team as the unit of analysis. The list of interaction dimensions for this type of project was the input to develop this stage, and the team developed the interaction network method for the design teams of construction projects in four multidisciplinary work sessions that included engineers, architects,

builders, consultants and linguists. In the first session, the team described each dimension 151 152 of interaction that would be evaluated in this type of project and the type of link framed in the SNA. In the second and third sessions, the team created the data collection survey and 153 identified the objective of the instrument, potential survey participants and distribution 154 method. In the fourth session, based on a review of the literature and its experience, the 155 team defined the metrics and sociograms that should be analyzed in each of the networks. 156 as well as the validation criteria. The final deliverable of this stage was the network 157 evaluation method in construction project design teams, which included a description of the 158 interaction dimensions, definitions of each interaction link type, the survey participants, the 159 collection method and the questions for the data collection, data validation, and definitions 160 of the metrics and sociograms to be analyzed for each interaction dimension. 161

In the third stage, the proposed SNA method was applied to a pilot project with the 162 objective of exemplifying the use of this method in terms of implementation and analysis. 163 The pilot project was a design team for a residential building project in the city of Santiago, 164 Chile. First, the main characteristics of the pilot project were described, e.g., project type, 165 166 location, members of the design team and some specific characteristics. Then, the researchers collected interaction data from the design team through an online survey server 167 (the survey created in phase 2 was used). The input data were validated according to the 168 criteria proposed in the coherence analysis. Next, the metrics of each dimension of 169 interaction were calculated, and the sociograms were graphed. Finally, the authors 170 interpreted these metrics and graphs according to the literature review. 171

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### 173 LITERATURE REVIEW OF INTERACTION NETWORKS

This section is divided into three parts: the first part explains the different dimensions of interaction that are generated in a work team; the second part describes some experiences of using SNA in the AEC industry and identifies which dimensions of interaction were evaluated and which metrics were used to carry out the analysis; and the third part describes the gaps between the use of SNA in the AEC industry and the dimensions of interactions in a work team with the objective of proposing the application of SNA to other dimensions of interaction and analysis.

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## 182 Dimensions of interaction in a work team

For a work team to be effective, several conditions associated with a compelling 183 direction, an enabling structure, a supportive organizational context and team coaching 184 185 must be present; teamwork has multiple dimensions that must be evaluated (Valentine et al. 2015). Specifically, some key performance elements of construction project design teams 186 are as follows: the encouragement of collaboration, creation of a unique and challenging 187 project, involvement of the team members in planning, commitment to the team, 188 acceleration of the team-building process, commitment of the members to the goal, a sense 189 of purpose, dedication to the time and effort required to form a team, opportunity for the 190 191 team members to become familiar with each other and the project, increased collaboration in the whole project, identification of the design team member roles and trust between the 192 193 team members (Svalestuen et al. 2015).

Several authors have reported a set of factors or dimensions that directly impact the effectiveness of a team in the AEC industry, and many of these factors are related to the concept of interaction. This review found that one of the first studies on teamwork in the

AEC industry was that of Baiden et al. (2006), who defined a list of 10 dimensions for an 197 integrated work team. The list was recently updated in the literature with the following 198 inclusion criteria: articles from the last five years; categories for the Web of Science 199 including "multidisciplinary engineering", "civil engineering", "construction or building 200 technology" and "architecture"; development of different dimensions or elements of 201 teamwork and not only the generic concept; and papers in the AEC industry professional 202 context. Educational papers were excluded from this study. Thus, the list was updated to 13 203 204 dimensions with the literature review of 17 papers from 2014 to 2019. Table 1 presents an updated list of dimensions that affect the integration of a work team. 205

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207	Table 1: Dimensions that impact a work team – percentage of paper that mentions it

Dimensions	Description	%
Single team focus and	All members have the same focus and work	100.00%
objectives	together towards team objectives (Baiden et al.	
	2006).	
Seamless operation with no	Members form a new single project team with no	70.59%
organization defined	individual member identity or boundaries, so there	
boundaries; coordination	is a high degree of coordination among team	
	members (Baiden et al. 2006).	
Mutually beneficial	Achievement project goals that benefits all	47.06%
outcomes	members	
Openly accessible design	Increased time and cost predictability, through a	52.94%
and construction	transparent information policy shared among all	
information	members(Baiden et al. 2006).	
Unrestricted cross-sharing	Availability and access to all project information	64.71%
of information	to all parties involved in the project (Baiden et al.	
	2006).	
Team flexibility and	Require personnel join and leave the project team	17.65%
responsiveness to change	as their skills are no longer required or are needed	
	(Baiden et al. 2006).	
Creation of single and co-	A single project team with all members located	47.06%
located teams	together in a common office (Baiden et al. 2006).	
Equal opportunity for	Consultation of members for contribution at all	58.82%
project	phases of project before decisions are made, i.e.	
	all members collaborate (Baiden et al. 2006).	

Equitable team relationships and respect for all, trust and team chemistry	All members are treated as having equal and significant professional capability needed on the project (Baiden et al. 2006).	64.71%
No blame culture	Collective identification and resolution of problems and collective responsibility for all project outcomes (Baiden et al. 2006).	58.82%
Learning among team members	Team members learn from each other about technologies, methodologies and ways of working (Herrera et al. 2018).	41.18%
Contract models or type of project delivery	To have a relational type of contracting system, where collaboration and integration of the project is promoted from early stages (Svalestuen et al. 2015).	52.94%
Identification of the design team members' roles	All team members should have a clear understanding of their roles and responsibilities, and that of other team members (Savolainen et al. 2018).	29.41%

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From these dimensions, the following dimensions of interaction can be deduced: transfer of information, linking of trust, coordination and planning, and collaboration and learning among team members. Undoubtedly, one of the most characteristic elements of an effective team is associated with having and working for a common goal; however, this factor, along with others, is not considered an interaction among team members. Therefore, the researchers considered only the dimensions that can be represented as an interaction between two or more people.

Typically, design teams adopt a goal-oriented approach by prioritizing and sharing only what is necessary; therefore, they exhibit a distributed knowledge system, in which they rely on each person properly knowing his or her role and on the concept that not everyone needs to know everything to succeed in a design project (Kleinsmann et al. 2012). The collaborative approach of team members is accompanied by systematic discussion and negotiation (Kleinsmann et al. 2012); thus, a shared understanding among all the team 222 members when they are making agreements is essential (Cash et al. 2017). This shared 223 understanding implies that the interaction of team members must be based on continuous 224 cycles of commitment (Viana et al. 2011).

Commitment cycles are understood as a network of commitments among the people in 225 226 a team (Flores, 2015). The commitments network approach emphasizes what people do while communicating, how the language is used to create a common reality and how 227 activities are coordinated through language (Viana et al. 2011). Basic elements of this 228 229 perspective are speech acts, which are a set of rules for systematizing commitment 230 management (Searle 1969). According to Medina-Mora et al. (1992), one of the methods to model commitment management is the action workflow. These researchers state that two 231 people are required to establish a commitment (a customer and a performer). The 232 commitment cycle has four phases: (1) request/proposal, (2) negotiate/agreement, (3) 233 declare compliance/performance and (4) declare acceptance/satisfaction (Medina-Mora et 234 al. 1992). The first phase is the request of a requirement from a customer (internal or 235 external) to someone who will perform the request. The second phase is the negotiation and 236 237 definition of satisfactory conditions and delivery dates between the customer and the performer. The third phase is the execution of the requirement according to the negotiated 238 conditions and declaration of its completion (Searle 1969). 239

Finally, the fourth stage is the assessment, declaration of acceptance and feedback from the customer (Searle 1969). The structure is defined by the language acts through which people coordinate, not the action performed by individuals to meet the conditions of satisfaction. Therefore, each of these speech acts can be considered specific dimensions of interactions that are interconnected (Flores, 2015).

Consequently, from the literature review, dimensions of interaction can be defined from 245 a traditional perspective and from a commitment management perspective. The traditional 246 dimensions of interaction identified were the following: transfer of information, linking of 247 trust, coordination, and collaboration and learning among team members. The dimensions 248 249 of interaction associated with commitment management are associated with each of the speech acts, i.e., requirements, negotiation, declaration of completion and declaration of 250 acceptance (Long and Arroyo 2018). In addition, a basic element for all work teams is that 251 252 all members know each other's roles and responsibilities.

253

# 254 SNA experiences in the AEC industry

SNA uses sociograms to represent relationships between different people (Hickethier et al. 2013). People are represented by nodes, and the line between them constitutes a connection or edge. Each network can be represented graphically with a sociogram and with mathematical metrics, which can be classified into organizational or network metrics and individual or node metrics (Al Hattab and Hamzeh 2015) (Table 2).

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#### Table 2: SNA Metrics

Туре	Metric	Definition	
Node	Degree	How many other nodes a node is connected to (Alarcón et al. 2013)	
	Betweenness	How many pairs of individuals are connected through a node with the least number of steps: brokerage role (Hickethier et al. 2013)	
	Closeness	How close a node is to other nodes: depends on the shortest average length (Al Hattab and Hamzeh 2015)	
Network	Density	How many actual links exist between nodes divided by the number of total possible links in the network (Alarcón et al. 2013)	
	Mean Degree	How many other nodes a node is connected to, on average	

	(Alarcón et al. 2013)
Clustering	How clustered groups of people are compared to the rest of the
	network, the existence of closed triads and small communities
	(Hickethier et al. 2013)
Average path	How many steps, on average, nodes require to reach each
length	other (Al Hattab and Hamzeh 2015)
Diameter	How many steps, nodes require to reach each other
	(maximum) (Al Hattab and Hamzeh 2015)
Modularity	How dense are the connections between nodes within groups
	compared to nodes with another group (Hickethier et al. 2013)

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Another interesting indicator to assess project teams is the number of connected 263 264 components. Components are sets of nodes that are linked to one another through continuous chains of connections; a connected network simply comprises a single 265 266 component (Scott 2017). The members of a component can communicate with one another, 267 either directly or through chains of intermediaries. On the other hand, isolated nodes have 268 no such opportunities; the number of connected components can be taken as an indication of the opportunities and obstacles to communication or the transfer of resources in the 269 270 associated network (Scott 2017).

271 Social networks can be characterized as directed or undirected links. Undirected links occur when two people have a bidirectional interaction obligation; in contrast, directed 272 273 links imply that the interaction flows from person A to person B. Therefore, directed links can be unidirectional or bidirectional (Hoppe and Reinelt 2010) depending on the 274 dimension of interaction being analyzed. Except for their degree, the metrics presented in 275 Table 2 do not change based on whether the links are directed or undirected. In directed 276 networks, there is a degree of input or indegree (number of connections reaching the node) 277 278 and a degree of output or outdegree (number of connections leaving the node); the metric 279 degree is obtained as the sum of both (Scott 2017). In addition, connected components can

be searched for in both undirected and directed graphs. However, there are importantdifferences between the two situations (Marin and Wellman 2011).

In the case of directed graphs, two distinct types of components can be identified: 282 strong components and weak components. A strong component is one in which the lines 283 284 that make up the paths are aligned in a continuous chain without any change of direction; thus, it represents a set of agents among which such resources can easily and freely flow 285 (Scott 2017). On the other hand, in a weak component, it can be assumed that the mere 286 presence of a relationship, regardless of its direction, allows some possibility for 287 communication; thus, weakly connected components represent semipaths in the network 288 (Scott 2017). In the case of undirected graphs, because no directions are attached to the 289 lines, all paths constitute acceptable connections (Scott 2017). 290

291 The relevant characteristics to carry out an SNA are the following: type of organization, 292 dimension of interaction and metrics. Table 3 exemplifies each of these characteristics from prior research that used SNA in AEC organizations. All these studies present case studies in 293 which an SNA was carried out, with the exception of the work of Al Hattab and Hamzeh 294 295 (2015), who present a theoretical analysis of an organization. In all the case studies presented in Table 3, data capture is carried out through surveys (paper or online) 296 conducted on the participants of the analysis (Flores et al. 2014; Herrera et al. 2018); 297 therefore, it must be assumed that there may be some subjectivity in the input data of the 298 SNA. 299

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Source	Type of organization	Types of interactions	Metrics
(Hickethier et al. 2013)	Design team (complex project)	Information flow	Clustering; centrality
(Alarcón et al. 2013)	Mining companies	Interaction; information flow; problem solving; planning; trust	Mean degree; diameter; density; average path length
(Priven and Sacks 2013)	Construction complex projects	Information flow; trust	Density
(Flores et al. 2014)	Construction Companies	Interaction; information flow; problem solving; planning; innovation; trust	Mean degree; diameter; density; average path length
(Al Hattab and Hamzeh 2015)	Design teams	Interaction; information flow	Density; average path length; modularity; clustering; centrality
(Segarra et al. 2017)	Architecture offices	Interaction; information flow; innovation	Mean degree; density; average path length
(Schröpfer et al. 2017)	Construction complex projects	Knowledge transfer	Density, degree, betweenness
(Herrera et al. 2018)	Designs team (complex projects)	Interaction; information flow; planning; learning; trust	Density
(Castillo et al., 2018)	Construction companies	Personal confidence, innovation development, interaction, relevant information exchange, planning and problem solving	Diameter, density, average path length, and average degree

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From the examples presented in the AEC industry (Table 3), the networks most frequently measured are those of interaction and information flow, and the metrics most analyzed are those linked to the organization (density, diameter, average path length) and not to the people (degree, centrality, betweenness). In addition, the analyses are performed on companies (Alarcón et al. 2013; Flores et al. 2014; Segarra et al. 2017) or complex projects (Hickethier et al. 2013; Priven and Sacks 2013; Schröpfer et al. 2017), where the number of participants is high (50 people or more). Furthermore, in these studies, it is not specified whether the links of the networks are directed or undirected, with the exception of Al Hattab and Hamzeh (2015), who clarify that the interaction has undirected links. In addition, none of these studies include a study carried out on the number of connected components.

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315 Gaps in SNA in the AEC industry

Two perspectives are identified within the dimensions of interaction: traditional 316 interaction and commitment management. According to the experiences found regarding 317 the use of SNA in the AEC industry, there is evidence of evaluations of dimensions of 318 traditional interaction in this industry, for example, interaction, information flow, problem 319 solving, planning, innovation, trust and learning. However, interactions such as knowledge 320 321 of roles and collaboration are not explicitly included because these elements have been 322 broadly studied as key elements in the effectiveness of a work team (Baiden et al. 2006; Savolainen et al. 2018; Svalestuen et al. 2015). In addition, Kereri and Harper (2019) 323 324 recently proposed to use SNA for the evaluation of collaboration in construction project teams. Furthermore, based on similar experiences in the AEC industry, there is no evidence 325 of interaction assessments associated with the perspective of commitment management, 326 327 although this element is key to a shared understanding in multidisciplinary teams in which discussion and negotiation are common (Kleinsmann et al. 2012). 328

For each dimension of interaction, an analysis of the social network can be performed; therefore, for each interaction, the links must be defined as directed or undirected, according to the nature of the interaction (Hoppe and Reinelt 2010). According to the SNA experiences in the AEC industry, this definition is not explicit; however, it is fundamental to the analysis of metrics and input data filtering because some metric calculations areaffected depending on the characteristics of the link (Scott 2017).

Because data capture is conducted through a survey of project team members, there will always be some amount of subjectivity of the input data; therefore, an analysis of the coherence of the input data must be performed before the SNA (Cisterna 2017). This coherence analysis can be performed in undirected networks in which, theoretically, there is a correspondence between the responses of the people involved, so that if person A wishes to interact with person B, then person B must indicate the same (Cisterna 2017).

341 Although there are metrics for SNA that have mathematical interpretations, a practical interpretation should be provided for the construction project design teams (less than 50 342 people) (Castillo et al. 2018a). In addition, new metrics should be proposed for the 343 dimensions of interaction associated with commitment management because these 344 345 networks interact with each other as part of a cycle, even though there are no SNA metrics 346 linking two or more networks. The definition of the link types (directed or undirected), the coherence analysis to validate the input data and the definition of new dimensions of 347 348 interaction, and their metrics and interpretation must be included in the existing SNA methodology (e.g., Alarcón et al. 2013; Flores et al. 2014). 349

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### 351 PROPOSAL FOR A NETWORK EVALUATION METHOD: METRICS AND

352 SOCIOGRAMS

The objective of this evaluation method is to capture data from different dimensions of interaction in construction project design teams. To develop the method, the following steps were followed: (1) definition of the interaction dimensions and description and definition of the link type for each interaction, (2) definition of the participants involved in the data capture and the data capture method, (3) definition of the questions (and type of answer) to
capture information for each interaction, (4) definition and analysis of the metrics and
sociograms for each dimension of interaction and validation data criteria and (5) data
collection and analysis.

Based on the literature review, the dimensions of interaction to be assessed were defined. Tables 4 and 5 present the description for each dimension of interaction and the type of link associated with each from the perspective of traditional interaction and commitment management, respectively. The description of each dimension of interaction and the type of link (directed or undirected) was determined by a multidisciplinary team of professionals. This team included engineers, builders, researchers, architects and linguists; all with experience in SNA and teamwork assessment in the AEC industry.

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Table 4: Descriptions of types of interactions – traditional

Type of interaction	Description	Type of link	Source
Knowledge of roles and responsibilities	When person A knows the role and responsibility of person B, a one-way link is created between the two people. This network is fundamental, since if the link does not exist, it is difficult to make another type of interaction.	Directed	Proposal
Global interaction	Refers to any type of interaction between two people, these include telephone conversations, mail exchanges, conversations or business meetings.	Undirected	(Alarcón et al. 2013)
Relevant work information	Relevant work information is that flow where person A sends necessary information to person B that adds value to the project but is not openly available.	Directed	(Castillo et al., 2018)
Collaboration	Collaboration refers to the act of joint work between two or more people. It is considered that working together implies working with another person on the same	Undirected	Proposal

	task and at the same time, either in person or virtually.		
Planning and problem solving	Collaborative planning and problem solving refer to the joint act of two or more people to define and redefine tasks, schedules, resources, costs, risks, etc.	Undirected	(Castillo et al., 2018b)
Trust	When a person A trusts the work of a person B, a one-way bond of trust between A-B is created.	Directed	(Priven and Sacks 2013)
Learning	When a person A learns something new from a person B, a learning link between A- B is created. What is learned can be something technical related to knowledge, some skill or competence, or even an attitude at work.	Undirected	(Herrera et al. 2018)

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Table 5: Descriptions of types of interactions – commitment management

Type of interaction	Description	Type of link	Source
Request for requirement	The speaker (customer) is asking a potential performer for action around a requirement.	Directed	(Long and Arroyo 2018)
Requirement negotiation	The customer and the performer clarify the requirement and define conditions of satisfaction, based on time, cost and performance.	Undirected	(Viana et al. 2011)
Declaration of compliance	The performer reports facts and is prepared to offer evidence about the compliance of the requirement.	Directed	(Long and Arroyo 2018)
Declaration of satisfaction	The customer reports a level of satisfaction and feedback about the compliance of the requirement.	Directed	(Long and Arroyo 2018)

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The people involved in the analysis are all those involved in the design phase, which may vary depending on the nature of the project. The roles that may be stakeholders are the project manager, architect, structural engineer, client, client representative, geotechnical engineer, MEP engineer, BIM manager, planning engineer, general contractor and others (Al Hattab and Hamzeh 2015). The interaction data capture tool is a survey that must be answered by those involved in the design phase. Because these stakeholders typically do not work in the same place, it is easier to use an online survey server. It is recommended to have a meeting with the project manager to discuss the scope and benefits of the analysis and to list the participants and their roles before sending the survey to all the participants.

382 The data capture survey has a question for each dimension of interaction. For each question, the respondents are asked to identify the other people and the dimension of 383 interaction they had in a defined period of time; this time depends on the context of the 384 project being assessed and the purpose of the assessment, e.g., if a design team wants to 385 386 evaluate only the detailed design phase, then the period of time should correspond to the duration of this phase of the project. In this case, the researchers used "the last twelve 387 weeks", based on previous experiences (Segarra et al. 2017). In addition, examples are 388 provided to ensure the question is understood. There are three types of answer for each 389 question: yes/no per person, number of times per person and frequency per person. Table 6 390 391 shows the answers associated with each type of network.

- 392
- 393

Table 6. Types of response for each type of interaction

Type of interaction	Response
Knowledge of roles and	Yes/No
responsibilities	
Global Interaction	
Trust	
Learning	
Relevant work	Always (1 or more times per day) / Often (1 to 4 times per
information	week) / Sometimes (1 to 3 times per month) / Never (less than 1
Collaboration	time per month)
Planning and problem	
solving	
Request for requirement	Yes/No
Requirement negotiation	Always (over 80% of the time) / Often (60% to 80% of the
Declaration of	time) / Sometimes (20% to 60% of the time) / Never (less 20%

compliance	of the time)
Declaration of	
satisfaction	

394

After capturing the data, it is necessary to validate their reliability. Therefore, a 395 396 coherence analysis is carried out on the undirected network "global interaction". Coherence analysis in undirected networks differentiates between valid and invalid interactions: if 397 person A wishes to interact with person B, and person B wishes to interact with person A, 398 then the interaction is valid; if person A wishes to interact with person B, and person B 399 400 does not wish to interact with person A, then the interaction is invalid. Therefore, it is possible to calculate a percentage of valid connections (PVC) as the proportion between the 401 402 valid connections and the total connections (valid and invalid). It is recommended to define a sufficiency condition or limit for this percentage, which ensures that the input data are 403 reliable and thus allows the SNA to continue (PVC must be defined by the assessment 404 team). The PVC has been obtained in other studies, and these values varied between 50% 405 and 90% (Cisterna 2017); however, there are no studies that provide information on the 406 definition of the PVC limit. In this case, the researchers used a pragmatic vision based on 407 408 general rules such as the concept of Pareto, which considers 80% predominant to explain a phenomenon (Craft and Leake 2002), or such a typical confidence level value (80%) used 409 in risk analysis of the construction industry (Alarcón et al. 2011). Therefore, the team 410 411 defined a limit percentage of 80% of valid connections for the data to be reliable; if the percentage was less than this condition, it may have meant that the question was understood 412 differently by the different survey participants. 413

414 If the validation of input data has a positive result, then the networks are represented 415 through an adjacency matrix. This matrix represents the link between pairs of people

through a weight; the weight depends on the type of response. Ones and zeros correspond 416 to responses of ves and no, respectively, and for answers of frequency, "never" is scored 417 with a zero, and the different levels are classified either in an ascending scale (1, 2, 3) or 418 with the value of 1 for all responses other than "never". In directed networks, it does not 419 420 matter whether the links are unidirectional or bidirectional, but in undirected networks, there must be a unique link between person A and person B. Therefore, it is necessary to 421 make a prior filter eliminating all the invalid interactions. Then, the adjacency matrix must 422 423 be loaded on to software that allows SNA, which provides metrics and sociograms for each dimension of interaction. 424

The sociogram analysis makes it possible to visually identify people or groups of 425 people who are disconnected or isolated, central people and people who serve as brokers or 426 bridges. It is interesting to analyze the changes generated in pairs or groups of networks: 427 428 knowledge of roles-global interaction, global interaction-work information, collaboration-429 planning, trust-learning and all commitment management networks. To perform metrics analysis, it is not necessary to analyze all the social network metrics in each type of 430 431 network; thus, depending on the network, the metrics to be analyzed are selected. Furthermore, in some cases, it is interesting to analyze metrics with data from different 432 networks. Table 7 presents the list of metrics for each network. In the next section, an 433 434 interpretation of each metric is performed using a pilot project.

To apply the proposed method, the activities outlined in Fig. 2 should be carried out. For the creation of the survey, it is first necessary to establish the initial conditions, such as (1) the definition of the interaction time period (e.g., the 12 weeks used in this pilot project); (2) definition of the data collection method, which, for noncollocated teams, is usually an online survey server or an in-person survey; (3) definition of the study

participants (client, architect, specialist engineers, project manager, etc.); (4) definition of 440 441 the limit for the PVC for validation of the reliability of the answers obtained; and (5) selection of the software to carry out the SNA (there are several free software packages 442 such as Gephi and iGraph). Second, the survey should be created considering all the 443 previous information, the descriptions of the interaction dimensions (Tables 4 and 5) and 444 the questions and answers for the evaluation (Table 6). Third, the survey should be sent to 445 the defined participants and the data collected; for small teams, it is recommended that 446 100% of the defined participants respond. Then, with the information collected, the data are 447 processed using the selected software, according to the type of link of each interaction 448 dimension, directed or undirected (information available in Tables 4 and 5). Then, the 449 metrics are calculated according to the definitions in Table 7, and the PVC limit criterion is 450 reviewed to determine whether the analysis can continue. If the PVC criterion is satisfied, 451 452 then the sociograms are created and the analysis proceeds. Finally, the analysis consists of two parts: an analysis of the metrics and sociograms according to the project context, which 453 can be done between the assessor and project manager, and a comparative analysis with 454 other experiences in the AEC industry reported in the literature (Table 3). 455

#### 456

### Table 7. Proposed metric for each network

Type of network	Metrics		
Knowledge of roles	In-degree of each node; Mean in-degree of the network		
and responsibilities			
Global interaction	Degree of each node; Mean and range degree of the network;		
	Network density; # connected components		
Relevant work	Percentage of bidirectional links; In-degree and out-degree of each		
information	node; Mean and range degree of the network; Network density; #		
Learning	weakly and # strongly connected components		
Collaboration	Percentage of bidirectional links; Degree of each node; Mean and		
Planning and problem	range degree of the network; Network density; # connected		
solving	components		
Trust	# links trust network / # links knowledge of roles network		

Request for	In-degree and out-degree of each node and the sum
requirement	
Requirement	Negotiated links / (requirements links / 2)
negotiation	
Declaration of	Compliance declaration links / requirements links
compliance	
Declaration of	Satisfaction declaration links / requirements links
satisfaction	

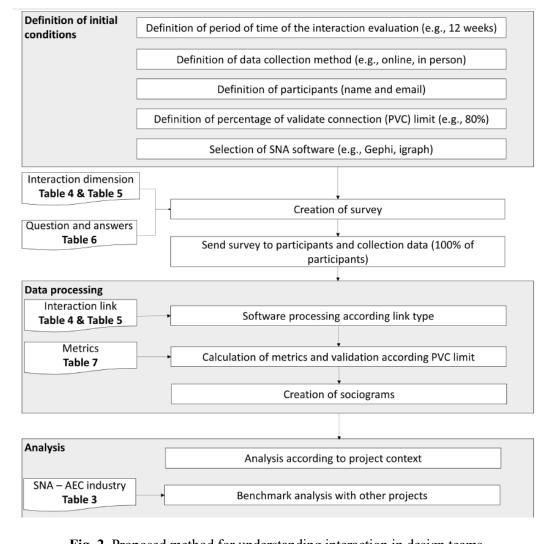


Fig. 2. Proposed method for understanding interaction in design teams

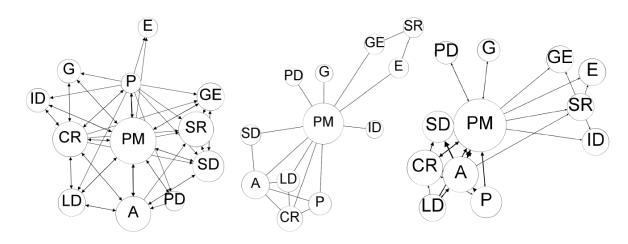
### 461 PILOT PROJECT: EVALUATION AND ANALYSIS

A pilot project was used to exemplify the use of the tool. The pilot project involved the design team of a project to build a 28,500 m<sup>2</sup> residential building consisting of 22 floors and two sublevels, located in the city of Santiago, Chile. This project had two important characteristics: (1) the client was the same company as the builder, which led to the expectation of a global vision for the project in its design and construction phases; and (2) all the specialties of the design phase were contracted to different companies, which was the opposite of a collocated situation.

During the design, 12 people participated in the following roles: project manager (PM), 469 client representative (CR), architect (A), geotechnical engineer (GE), structural designer 470 (SD), structural reviewer (SR), electrical specialist (E), plumbing specialist (P), gas 471 specialist (G), pool designer (PD), irrigation designer (ID) and landscape designer (LD). 472 473 The PM and CR were part of the client's company, and the rest of the personnel were from 474 different companies, so much of the interaction was through emails and phone calls. In this project, only the architecture office worked on a BIM platform and the specialties in a 475 476 traditional way (2D drawing and specialized analysis software) (Rojas et al. 2019), so it was not possible to capture the interaction data that were logged in the BIM environments. 477 All the stakeholders answered the online survey to provide data about the team interaction. 478 479 The analysis of the consistency of the responses of the global interaction network gave a percentage of valid interaction of 85.71%; thus, the input data were reliable for performing 480 the SNA, according to the 80% limit proposed by the research team. 481

482 Currently, there are no studies that define the ideal range for the metrics; however, a 483 comparative analysis was performed using the values obtained from projects of similar size 484 (number of participants). Because a project is a temporary organization in which all the

participants have the common objective of carrying out the design, it is expected that all the 485 486 participants know their roles, and the mean degree must be close to the number of participants minus one. In the pilot project, the average grade was 4.33, i.e., one person 487 knew the role of approximately four other people. Fig. 3 (left) shows the role knowledge 488 network, in which the size of the nodes is proportional to the level of knowledge of the 489 entire organization toward that node (indegree). Therefore, in this organization, the 490 knowledge toward the project manager was at the first level, with the area of architecture 491 and structures at the second level and other design specialties at the third level. In a small 492 team such as the one in this project, one would expect all the specialists to know the roles 493 and responsibilities of the others (Svalestuen et al. 2015). However, on average in this 494 project, each person knew the role of only one-third of the team. 495



496

497 Fig. 3. Knowledge of roles network (left)/ Global interaction network (middle)/ Relevant work
498 information (right)

In the global interaction network (Fig. 3 center), all the nonreciprocal connections first needed to be eliminated because it was an undirected network. The density of this network was 0.273 with a mean degree of 3, i.e., an average person connected with three others. However, there was also a high variability (range equal to 9). Thus, the lowest degree was

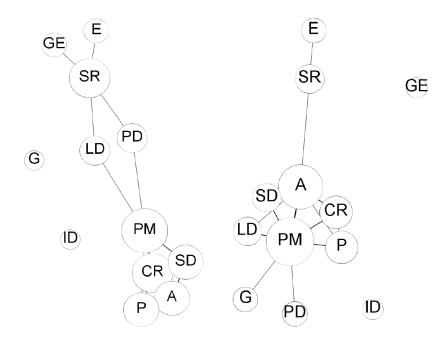
1, and the highest degree was 10. This density value was low compared to the value 503 504 obtained in the airport design teams in which the density of the interaction network was approximately 0.5 (Herrera et al. 2018). This phenomenon may have been due to the 505 context of the typology of the project, e.g., in architecture offices the density varies 506 507 between 0.4 and 0.5 in teams of this size (Segarra et al. 2017), or in construction teams on the worksite, the density varies between 0.4 and 0.7 (Priven and Sacks 2013). The project 508 manager is the node with the highest number of connections, and from this node there is a 509 connected group (number of connected components equal to 1). In this work, the project 510 511 manager was an important node of articulation, because if it was taken out of the network, then the number of connected components increased to five, leading to a team with two or 512 more subgroups (in this case five), in which the interaction between the specialists and 513 other team members might be difficult. Note that in this case, the global interaction network 514 515 is a subnetwork of the role knowledge network, i.e., for people who can interact, first the 516 roles of each of the team participants must be presented and defined. Therefore, the kick-off meetings are essential to initiate the expected interaction between the different 517 518 professionals (Koo et al. 2013), and they should be utilized in all project teams.

Fig. 3 (right) shows the relevant work information network in the pilot project, and the 519 thickness of the arrow represents the frequency of the information flow, i.e., the network. A 520 521 thicker arrow shows a higher frequency of information. The reciprocal connections, which constituted 67.65% of the information network, included the participation of the client's 522 representative, the project manager, the architect, the structural designer and a few 523 specialist designers. The density was 0.258, which was low compared to the value obtained 524 in airport design teams in which the density of the interaction network was approximately 525 526 0.4 (Herrera et al. 2018). Moreover, in larger design teams (between 40 and 60 people) the

integrated density was approximately 0.1 (Al Hattab and Hamzeh 2015). Thus, a team four 527 528 or five times larger than the pilot project only reduced the density by half. The mean indegree was 2.83, and its range was 7; the mean outdegree was 2.830, and its range was 529 10. Therefore, there was high variability regarding the sharing of work information, which 530 531 demonstrated an inhomogeneous flow of information that focused on the project manager and the architect. There was one weakly connected component and five strongly connected 532 components. Thus, the network was weakly connected, and, as in the interaction network, it 533 was strongly dependent on the project manager, which was contrary to the goals of lean 534 management practices regarding the transparency of information (Wesz et al. 2018) and 535 was greater among the specialists through technology (American Institute of Architects 536 California Council 2007). 537

Collaboration and planning are strongly related to problem-solving networks because 538 planning can be a type of collaboration. Therefore, the planning network should be a subnet 539 540 of the collaboration network. Both types of networks have undirected links, and all invalid connections must first be removed. In the case study, both networks had similar 541 542 characteristics, which was evidenced by their indicators. The proportion of reciprocal connections was 90.32% in both cases, which explained the high reliability of the input 543 data. Additionally, in both networks, there were two disconnected people (three related 544 545 components), meaning there was no collaborative planning. Finally, the collaboration and planning had a density of 0.212 and a mean degree of 2.330. Thus, there were 10 people 546 who were connected; however, for most of the opportunities the project manager was the 547 intermediary (Fig. 4). Therefore, in this project, there were no planning activities and 548 collaborative work because the planning was carried out in meetings of two or three people 549 550 and not among the 12 people who made up the work team. Current technologies and design

551 methodologies support collaborative work and planning among the specialists to achieve 552 greater understanding and time efficiency in projects, which produces better results in the 553 designed product (Rahmawati et al. 2014).



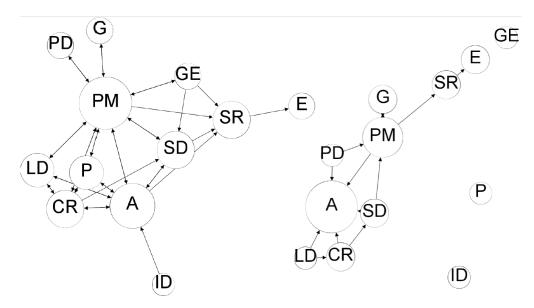
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555

**Fig. 4.** Collaboration network (left) / Planning and problem-solving network (right)

556 The level of trust between members of a team is fundamental for a team to be effective (Austin et al. 2015). In the pilot project, the trust network was created (Fig. 5). In this 557 558 project, there were 36 connections of trust and 52 connections of knowledge of roles, which meant that the relative level of trust was 0.690 in the network and that there was a high 559 degree of trust between the people who knew each other. However, note that the level of 560 561 knowledge of roles in this organization was low (density 0.394); of the four people a team member knew, he or she trusted two or three, on average. Therefore, in this team, there was 562 no problem of trust but rather of knowledge of the team and greater collaboration. 563 However, there was no evidence that an increase in the links of knowledge would result in 564 an increase in the network of trust, but it is known that through collaboration and 565

collaborative planning, trust can be strengthened (Flores et al. 2014). To learn from another 566 567 person, it is necessary to trust that person (Karp et al. 2019); therefore, the learning network is a subnet of the trusted network (Herrera et al. 2018). In the case study, a small learning 568 network was obtained, in which only 9 of the 12 stakeholders of the project participated and 569 570 in which their level of connectivity was weak because their mean degree was 1.083, their density was 0.247 and the percentage of reciprocal connections was 7.69%. Thus, an 571 average person learned from only one person, although there was an opportunity to learn 572 from 11 others. Therefore, in this project, there was an important growth gap in the learning 573 network, given that organizations need to be constantly learning, especially with the 574 implementation of new technologies (Wong et al. 2014). 575



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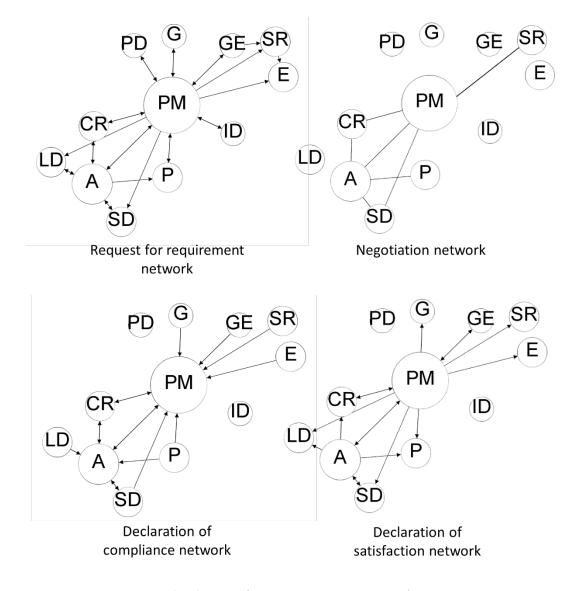
**Fig. 5.** Trust network (left) / Learning network (right)

The multidisciplinary design process involves continuous discussions and negotiations among the participants, so it is essential to manage the commitments correctly (Cash et al. 2017). A network was created to allow for each step to have a reliable commitment (Fig. 6). The request for requirements network is a measure of the requests made by the people

involved for some task or document. The indegree of person A represents the number of 582 583 people who request something from person A and not the number of requirements that person A has, and the outdegree of person A represents the number of people to whom 584 person A is sending a request. In the pilot project, the sum of the input degrees of each node 585 586 was 27, which meant that there were 27 connections between people, of which 7 were unidirectional and 20 were bidirectional. In the negotiation requirements network, the 587 connections can be visualized as a negotiation between those involved. With this 588 589 information, the percentage of negotiated requirements in the pilot project was calculated to be 51.85%. 590

After a request, the requirements correspond to a declaration of completion. In the pilot 591 project, the percentage of declaration of compliance was 59.25%, and when only the 592 negotiated requirements were reviewed, the percentage reached 100%. Therefore, the 593 discussion generated in the negotiation required a "following compliance declaration". The 594 595 percentage of declarations of acceptance was 62.96%; the customer declared satisfaction in 596 approximately 6 out of 10 requirements. For cases in which the only declared requirement 597 was fulfillment, the percentage increased to 93.75%. This result confirms the need to include these four steps in the process of creating the correct management commitment 598 requirements and to ensure a shared understanding among the participants. 599

600



602

601

Fig. 6. Commitment management networks

To summarize, in the pilot project, weak interactions were identified that were strongly centered on the project manager, with low interactions between different designers. This low interaction was initially caused by a lack of knowledge of the roles of the members of the team, a critical element in the project, in which each designer was from a different company. Thus, the kick-off meeting was fundamental in this project (Koo et al. 2013). Regarding commitment management, a low level of negotiation of requirements (clarifying

<sup>603</sup> 

deadlines, resources, scope, etc.) was identified, which affected the declarations of compliance and satisfaction without achieving the cycle for correct commitment management. Therefore, there was no continuous cycle of commitments affecting the shared understanding among the team members (Viana et al. 2011), which may have affected the design process, generating more rework or other wastes (Cash et al. 2017).

The application of the method involves three major efforts: (1) obtain answers from all 615 the participants of the survey, (2) process the data with software, and (3) analyze the data 616 and understand the context. To obtain answers from all the participants of the survey, the 617 evaluator must have an internal organizational partner to facilitate the process. In addition, 618 the people should understand the questions equally, so the coherence analysis is 619 fundamental. In the pilot project, a PVC of over 80% was achieved, demonstrating that 620 there was a good understanding of the questions by the respondents. Additionally, the 621 creation of the questions for each type of interaction should be done with an understanding 622 623 of the industry context and the language used by the design team being evaluated. In this case, the survey was created by a multidisciplinary team of engineers, architects, builders, 624 consultants, and linguists, which allowed a broad and contextualized view of the 625 characteristics of a design team. Then, to process and analyze the data, the evaluator must 626 understand that, with this method, the results of the analysis give no answers but reveal 627 where to ask questions (Alarcón et al. 2013), so it is essential to understand the context of 628 the organization. There are two main limitations to the application of this method: first, 629 there is no willingness on the part of the work team to respond judiciously to the survey; 630 and second, the study has a punitive purpose. These limitations affect the objective of 631 understanding the design team interaction that would allow it to improve and strengthen the 632 633 channels in which the team interacts. In future studies, new types of interaction and new

634 metrics can be added to analyze and understand the interactions of design teams in 635 construction projects. In addition, assessments could be done in conjunction with other 636 techniques for evaluating interaction and teamwork.

637

#### 638 CONCLUSIONS

For a design team to be successful, the design participants must have high levels of 639 interaction. To evaluate the interaction, a method was proposed to understand the 640 641 interactions in this type of work team using SNA as a tool and evaluating the interaction 642 from a multidimensional point of view. The key dimensions of interaction in a design team were identified and grouped into two groups: traditional interaction and commitment 643 management. The latter group is fundamental in design teams because there are instances of 644 systematic discussion and negotiation that oblige the team to have a shared understanding 645 646 of the actions to be followed. In addition, this was the first time that speech acts were 647 modeled using SNA. The SNA is a tool that allows global and individual analysis in a visual format and with mathematical indicators. Each dimension of interaction is 648 649 represented as a network and may have an individual analysis; however, it is also necessary to perform an analysis between two or more networks. The proposed method has the 650 following practical applications: (a) understanding the interactions of the design team from 651 several perspectives; (b) taking corrective actions to improve the interaction to make it 652 more efficient and less dependent on a single person; (c) recognizing the causes that 653 generate a shared misunderstanding among the members of the team; and (d) taking actions 654 in this matter, such as generating knowledge of roles, meetings for collective planning, and 655 opportunities for collaborative work. These benefits can improve the common 656 657 understanding of project requirements, reduce waste and increase the value of the design process. The application of the method requires that all the members of the design team respond to the survey; therefore, there must be a commitment from the organization that is being assessed. In addition, respondents should equally understand the questions, so the evaluation team should write the questions in context and verify the PVC limit through coherence analysis. In addition, the evaluation team and the design team should understand this method as a tool for continuous improvement and not as a punitive mechanism.

There are some limitations to this method. The tool is used for evaluation over time; 664 therefore, comparisons should be made between projects with similar levels of progress. In 665 666 addition, the researchers only assessed a pilot project with the SNA tool. For future research, it is recommended to perform assessments with this method on a large number of 667 design teams with different compositions, e.g., collocated/noncollocated teams, different 668 numbers of companies, different management systems and different technology application 669 670 levels (BIM environments), to understand how the context, management and technology 671 affects interactions between team members. In addition, it would be interesting to evaluate new dimensions of interaction, study new metrics for small networks and analyze their 672 quality and evaluate the metrics between different networks. Furthermore, in projects that 673 work in BIM environments, it would be interesting to contrast the networks obtained from 674 the log files and the networks obtained with the proposed method. 675

676

### 677 DATA AVAILABILITY STATEMENT

Some or all data, models, or code used during the study were provided by a third party
(list items). Direct requests for these materials may be made to the provider as indicated in
the Acknowledgements

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683

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