

Methods/Theory Research Brief: Findings from a Scoping Review of Social Network Analysis in Engineering Education

Dr. Jack Elliott, Minnesota State University, Mankato

Dr. Jack Elliott is an assistant professor at Iron Range Engineering, a part of Minnesota State University Mankato. Dr. Elliott received his PhD in Engineering Education and M.S. in Mechanical Engineering from Utah State University as an NSF Graduate Research Fellow. His research includes student social support networks in engineering education, experimental fluid dynamics, and developing low-cost technology-based tools for improving fluid dynamics education.

Dr. Darcie Christensen, Minnesota State University, Mankato

Dr. Darcie Christensen is a probationary Assistant Professor in the Department of Integrated Engineering at Minnesota State University Mankato. She teaches for Iron Range Engineering on the Mesabi Range College Campus. Dr. Christensen received her Ph.D. in Engineering Education from Utah State University in the Summer of 2021. The title of her Dissertation is "A Mixed-Method Approach to Explore Student Needs for Peer Mentoring in a College of Engineering." Darcie holds a Master of Engineering (2017), both from Utah State University. She is passionate about student success and support, both inside and outside of the classroom.

Dr. Justine Chasmar, Minnesota State University, Mankato

Dr. Chasmar is a professor for Iron Range Engineering's Bell Program through Minnesota State University, Mankato. She teaches self-directed learning classes for the professionalism curriculum, one of the three pillars of the Bell Program. Dr. Chasmar earned a Ph.D. in Engineering and Science Education and M.S. and B.S. in Mathematical Sciences from Clemson University. She is a STEM educator, practitioner, and scholar.

Dr. Chasmar spent the last decade serving in and directing learning centers. Most recently, Dr. Chasmar served as an Assistant Professor of mathematics and the founding Director of the Quantitative Reasoning Center at Goucher College, supporting student numeracy and STEM programs across campus. Prior to that, she coordinated large student support programs in learning centers at Clemson University and the Georgia Institute of Technology.

Dr. Chasmar's research focuses on student motivation, self-directed learning, numeracy education, and professional identity development. Through her background in learning centers, she has applied this research to undergraduate students and peer learning programs.

Katie Scherf, Minnesota State University, Mankato

Katie Scherf is a facilitator at the Iron Range Engineering Program, a cooperatively-based engineering program at Minnesota State University, Mankato. In this role, Katie provides coaching and professional mentorship to upper-division students, focusing on guiding them through design projects and other work-based engineering challenges. Katie's research is in reviews, social network analysis, and relevant applications in engineering education.

Methods/Theory Research Brief: A Scoping Review of Social Network Analysis in Engineering Education

Interpersonal relationships are a key aspect of success for engineers [1]-[3]. As elaborated by theories such as the Network Theory of Social Capital [4], [5], an individual's access to certain resources can be indirectly increased through access to other individuals with those resources. Considering knowledge as a resource, this idea parallels the earlier established social constructivist epistemology, where access to individuals who hold new knowledge is a key part of effectively integrating knowledge into a learner's existing construction [6]-[9]. Over the last several decades, engineering education has increasingly recognized the importance of interpersonal connections [10] and has even included "the ability to effectively work in teams" as an ABET outcome [11].

Despite knowing interpersonal relationships are important for effective engineering, how to establish or incentivize groups positively, within and outside the classroom, is a persistent question. Thus, a breadth of engineering education research has sought to identify effective methods for assessing interpersonal networks' existence, evolution, and relationship to outcomes [12]-[17]. Among the many methods for studying interpersonal networks, Social Network Analysis (SNA) has emerged as a particularly effective method. Specifically, SNA borrows from the larger field of network analysis [18], [19] by assigning individuals in a network as graph vertices (V) and connections between the individuals as graph edges (E). With a graph (G) summarizing the individuals and connections in the network: G = (V, E), researchers apply relevant network-theoretic mathematics to quantitatively describe traits of the larger network, sub-networks, and individuals in the network.

Researchers applying SNA have quantitatively identified relationships between interactions and outcomes including the relationship between engineering students' engagement with instructors and grade performance [20]-[24], the likelihood of retention according to integration at an institution [25]-[27], and even assessed STEM educators' community involvement [28]. However, across these studies, our review of the relevant literature for prior study purposes identified redundancies, a relative lack of SNA in certain contexts, and literature reviews that focused only on the online context [14], [29]. To address these potential issues and identify areas for subsequent research, we underwent a scoping literature review of research in the engineering education context which included SNA. To guide our research toward the study purpose, we prepared the following Research Questions (RQs):

RQ1: What is the current breadth of SNA in the engineering education context? **RQ2:** What areas of SNA in engineering education warrant systematic review(s)?

For this research brief, we present key publication, study context, and methodological trends in the data through an analysis of code frequency. Specifically, we will focus on findings related to RQ1 by identifying the number of records that included each code.

Methodology

A scoping review, as presented by Grant and Booth "provides a preliminary assessment of the potential size and scope of available research literature" [30, p. 95]. We selected this

methodology, similar but distinct from a mapping review, as this study aims to identify the extent of existing literature, particularly the study design features, and to understand the breadth and depth of SNA applied in the engineering education context for performing subsequent systematic reviews. To ensure quality in our findings while recognizing the potential limitations of scoping reviews in oversimplifying prior work, we identified study records in the three standard steps of systematic reviews identified by PRISMA standards for literature search and appraisal [31]: identification, screening, and inclusion. Identification included an initial search, selection of validation papers to be included in the final review, and iterative meetings with a university librarian for an expert appraisal of the terms and process. Our final keyword search, applied in the ERIC, Education Source, and Scopus databases entry format was:

(Social network analysis OR "network analysis" OR social network OR network centrality) AND (classroom OR education OR students OR faculty) AND (engineering).

To ensure the findings were relevant to the engineering education research context and to meet the needs of the research team we prepared the following Inclusion Criteria (IC):

IC1: The study must be written in English.

IC2: The study must be a completed, primary source (no reviews or works in progress included). **IC3:** The study must be published in 2022 or earlier.

IC4: The study must be peer-reviewed and refereed (i.e., conference papers and journals).

IC5: The study must apply SNA methods. Specifically, network analysis of social interactions.

IC6: The study sample must include engineering undergraduate/graduate students or educators.

Two coders applied these criteria, coding to consensus, to identify 59 final papers for analysis from the 3,197 search records. Figure 1 shows the entire scoping search and appraisal processes.



Figure 1. PRISMA diagram [31] of scoping literature review search and appraisal processes, extended from [32].

The full-paper review began with four coders each independently coding 3-5 papers according to the *a priori* categories described and developed in [32]. These categories included Paper Descriptors, Sample Descriptors, Methodology, SNA Data Collection, SNA Techniques, and Other Methodological Notes. The full research team met after coding the initial papers independently to discuss codes within these categories that should be added, omitted, adjusted, etc. This process was repeated twice and included identifying general study design areas of interest (e.g., methodology) and potential categorical values (e.g., mixed-methods or quantitative). After codes were finalized and written descriptions recorded for each code, the research team recorded relevant responses in a coding table for the remaining papers. This included deductively recording the *a priori* values for relevant categorical data, recording quantitative values as appropriate, and recording then memo-ing for those values that did not meet the *a priori* categorical or numeric codes [33]. Finally, the research team inductively coded those values that did not meet the requisites for the deductive codes and completed a final cycle of coding according to the full deductive and inductive codebook.

Results

To begin, we present the number of the 59 identified records that included SNA in the engineering education context by year of publication in Figure 2.



Figure 2. Review record counts vs. publication year.

From these data, we observe the emergence of SNA as an engineering education research method in 2006 and an increase in the use of SNA over the last two decades. Trends in these data also include a shift from most annual publications in conferences to most annual publications in journals within the last several years.

To identify and summarize record study context and methodological trends pertinent to our RQ, we deductively developed categories and inductively developed codes within the *a priori* categories. These codes relevant to the study design and context, and the count of records according to each category, are presented in Table 1.

Primary	Codes	Count
Category		(n)
Sample	Students	48
Туре	Faculty/Staff	10
	Other	2
Participants'	Unspecified	20
Engineering	or General	30
Major	Civil	4
	Software	3
	Mechanical	3
	Biomedical	2
	Computer	2
	Construction	2
	Aerospace	1
	Electrical	1
	Industrial	1
	Materials	1
	Systems	1
	Technology	1
Study	US	26
Country	China	6
	Australia	4
	Taiwan	2
	Chile	2
	Switzerland	2
	Finland	1
	India	1
	Portugal	1
	France	1
	Spain	1
	Ecuador	1
Participant	Year 1	19
Year	Year 2	17
(Students)	Year 3	13
	Year 4	17
	Graduate	9

Primary Category	Codes	Count (n)
Study Total	< 50	17
Sample Size	50 to 100	18
	101 to 250	14
	251 to 1000	5
	>1000	4
Sample	Yes	31
Demographics Provided?	No	28
Study Course	Face-to-Face	14
Delivery	Online	7
Method	Hybrid	7
Methodology	QUAN	35
	Mixed	24
Sampling in	Cross-Sectional	37
Time	Longitudinal	20
	Pre-Post	5
Network Data	Survey	35
Collection	Auto	20
Methods	Observation/Interview	8
Survey Type	Closed	21
(<i>iff</i> survey)	Open	15
Network	Online	20
Interaction	Face-to-Face	7
Туре	Hybrid	7
	Not Specified	25
Longitudinal	<1 Semester	3
Sample	= 1 Semester	10
Duration	>1 Semester	5
Longitudinal	Continuous	9
Sampling	3	2
Frequency	4	2
(weeks/	5	2
Sample)	8	1
	52	1

Table 1. Study record counts vs. categories.

*Note, record count sums across primary categories may give less than or greater than the 59 total review records due to code co-occurrence and/or lack of applicability.

Overall, results demonstrate several areas of interest including the breadth of areas SNA has been applied, the relative focus of SNA in certain study contexts, and the specific focus of research applying SNA in certain data collection methods.

Discussion

Our analysis of these results identified several areas of particular interest in the relevant literature. To begin, Figure 2 demonstrates SNA as an engineering education method emerged concurrent with the development of engineering education as a discipline [34] adopting research methods from educational, learning, and social sciences [35]. Further elaborating this trend, the first identified record is a conference article and matches the expectation of methods being implemented in conference publications before maturation into journal publications several years later [36]. Qualitatively, this trend of periodic increases then decreases in conference publications, followed by time-delayed periodic increases then decreases in journal articles is exhibited throughout the data in Figure 2.

Clusters and Gaps in Study Contexts

Beyond the emergence and growth of SNA as a research method well-suited to the engineering education context, there exist several clusters of interest in the study samples. The first groups of interest we identified according to the three main study sample types: engineering students (81%: 48/59), engineering faculty and/or staff (17%: 10/59), and other (3%: 2/59). The "Other" category is of particular interest and is the result of two studies which analyzed communication networks within online, openly available engineering platforms that were not restricted to engineering students or faculty/staff. Outside of the other category, there is an emphasis in the research on undergraduate engineering students over research considering engineering faculty/staff. Further, within the records including student participants, only 19% (9/48) of those student-specific studies included graduates. Interestingly, however, the degree-path-completion specific categories do not have a relative emphasis, contrasting our expectations that there was a methodological focus on specific years. However, this finding may also be a result of the lack of specificity in some sample descriptions, and the overall general approach to describing samples in many of the studies.

To elaborate this point, only 53% of the records explicitly described the demographics of the study sample. This issue is of particular importance, as recent research suggests that student networks have a strong likelihood for *homophilic tendencies* (students selecting others to interact with who have similar traits [37]): along gender, race, ethnicity, sexuality, and other factors are particularly important in network formation and evolution [38]-[40]. Further, these tendencies can be particularly sensitive to multiple traits and intersectionality, highlighting the issues in network analysis which does not adequately sample participant demographics [27], [39], [41]. *Thus, the first key finding of this study is the relative lack of adequate demographic data collection and reporting, which is of particular importance in the engineering education network context.*

Gaps in Network Participant Bounds

Beyond trends in the study sample descriptors, we also identified several interesting trends within the study methods. The first of these trends is the focus of these studies on smaller samples. Specifically, 60% (35/59) of the studies used a sample of 100 or fewer participants, which are likely related to a single small to medium-sized course or a subsample from course(s). Further, only 15% (9/59) of the studies identified included a sample larger than 250 participants, suggesting samples larger than a single course. This indicates a likely focus of studies in engineering education applying SNA in a single course. While valuable, prior research has demonstrated that student networks, even peer-to-peer support networks for course-specific content, are not wholly captured by single-course enrollment [22], [42]. *Thus, the second key finding of this study is the relative lack of holistic networks/large samples used for SNA in engineering education*.

Gaps in Longitudinal Network Sampling

Continuing this line of reasoning, we considered the length of network studies, which has demonstrated importance in the efficacy of network interventions whose effects are only captured beyond a single semester in time [25], [40]. Recognizing this importance, we highlight that only 34% of the studies gathered longitudinal data, and only five studies (8%) extended beyond a single semester in sampling. Thus, the final key finding of this study is an elaboration of the second key finding: *there is a significant lack of engineering education research that considers holistic networks/networks beyond a single semester in time*.

Conclusion

This research brief summarizes study context and design findings from a larger scoping review of Social Network Analysis applied in the engineering education context. The purpose of this review is to identify the current breadth of SNA applied in the engineering education context and identify areas for subsequent research. Among the selected findings of this review, this brief demonstrates the emergence and persistence of SNA in the existing body of engineering education literature as a method to quantify and analyze interpersonal relationships between engineering students, faculty, staff, and interested independent learners.

Despite the breadth of applications, we also identified several key areas for SNA to provide future benefits including a) the need for future SNA studies to consider and thoroughly report participant demographic data, b) the importance of extending student network data beyond a single course in participants, and c) the importance of extending network data collection beyond a single semester in time. While we believe these findings independently add value to the existing body of literature by summarizing the breadth and depth of existing literature and providing several areas to emphasize for future research, our later presentation of this work will extend these findings. Continued plans for this study include analyzing the coincidence of categorical codes (e.g., identifying and considering the number of papers that were longitudinal and had a sample > 250 participants,) and quantitative clustering of existing papers through bipartite network projection and subsequent clustering [18], [43], [44]. Finally, we will develop recommendations for efficient strategies to study networks that meet the existing gaps, recognizing the increased resource cost incurred by extending network sample bounds.

References

Note, that all review articles are preceded by an asterisk (*).

- [1] J. Wolfe and B. Powell, "Identifying successful interpersonal communication strategies for women in masculine settings," in *2014 ASEE Annual Conference & Exposition Proceedings*, ASEE Conferences, pp. 24.687.1-24.687.14. doi: 10.18260/1-2--20579.
- [2] D. Lopes, M. Gerolamo, Z. Del Prette, M. Musetti, and A. Prette, "Social Skills: A Key factor for engineering students to develop interpersonal skills," *International Journal of Engineering Education*, vol. 31, pp. 405–413, Jan. 2015.
- [3] M. Handley and C. G. P. Berdanier, "Operationalizing interpersonal behaviours of leadership for early-career engineers," *International Journal of Engineering Education*, vol. 35, no. 3, pp. 719– 732, 2019.
- [4] N. Lin, "Building a network theory of social capital," *Social capital*, pp. 3–28, 2017.
- [5] Simon, Peter A. "Social Network Theory In Engineering Education." PhD diss., Carnegie Mellon University, 2014.
- [6] M. Arvaja, "Collaborative knowledge construction in authentic school contexts," 2005.
- [7] K. Yilmaz, "Constructivism: Its theoretical underpinnings, variations, and implications for classroom instruction," *Educ Horiz*, vol. 86, pp. 161–172, 2008.
- [8] K. L. Lockhart, M. K. Goddu, E. D. Smith, and F. C. Keil, "What could you really learn on your own?: Understanding the epistemic limitations of knowledge acquisition," *Child Dev*, vol. 87, no. 2, pp. 477–493, 2016, doi: 10.1111/cdev.12469.
- [9] L. Vygotsky and M. Cole, "Mind in society: the development of higher psychological processes," 1978.
- [10] H. J. Passow, "Which ABET competencies do engineering graduates find most important in their work?," *Journal of Engineering Education*, vol. 101, no. 1, pp. 95–118, 2012, doi: https://doi.org/10.1002/j.2168-9830.2012.tb00043.x.
- [11] ABET, "Criteria for Accrediting Engineering Programs, 2025 2026," 2025.
- [12] S. A. Kalaian, R. M. Kasim, and J. K. Nims, "Effectiveness of small-group learning pedagogies in engineering and technology education: a meta-analysis," *Journal of Technology Education*, vol. 29, no. 2, p. 16, 2018.
- [13] T. Chowdhury and H. Murzi, *Literature Review: Exploring Teamwork in Engineering Education*. 2019.

- [14] K. Cela, M. Sicilia, and S. Sánchez, "Social network analysis in E-learning environments: A Preliminary Systematic Review," *Educ Psychol Rev*, vol. 27, no. 1, pp. 219–246, 2015, doi: 10.1007/s10648-014-9276-0.
- [15] O. Aljohani, "A comprehensive review of the major studies and theoretical models of student retention in higher education," *Higher Education Studies*, vol. 6, no. 2, p. 1, Feb. 2016, doi: 10.5539/hes.v6n2p1.
- [16] L. Springer, M. E. Stanne, and S. S. Donovan, "Effects of small-group learning on undergraduates in science, mathematics, engineering, and technology: A meta-analysis," *Rev Educ Res*, vol. 69, no. 1, pp. 21–51, 1999.
- [17] O. Casquero, R. Ovelar, J. Romo, and M. Benito, "Reviewing the differences in size, composition and structure between the personal networks of high- and low-performing students," *British Journal of Educational Technology*, vol. 46, no. 1, pp. 16–31, 2015, doi: 10.1111/bjet.12110.
- [18] Alber-Laszlo Barabasi, Network Science, 1st ed. Cambridge University Press, 2016.
- [19] S. P. Borgatti, M. G. Everett, and J. C. Johnson, *Analyzing Social Networks*. SAGE Publications Ltd, 2013. [Online]. Available: https://books.google.com/books?id=VjS6NAEACAAJ
- [20] *G. Putnik, E. Costa, C. Alves, H. Castro, L. Varela, and V. Shah, "Analysing the correlation between social network analysis measures and performance of students in social network-based engineering education," *Int J Technol Des Educ*, vol. 26, no. 3, pp. 413–437, 2016, doi: 10.1007/s10798-015-9318-z.
- *M. Zhu and M. Zhang, "Network analysis of conversation data for engineering professional skills assessment. Research Report. ETS RR-17-59," *ETS Research Report Series*, 2017, [Online]. Available: http://dist.lib.usu.edu/login?url=http://search.ebscohost.com/login.aspx?direct=true&db=eric&A N=EJ1168601&site=eds-live
- [22] *Elliott, J., Minichiello, M., & Ellsworth, J., "Examining relationships between student interactions with peers and resources and performance in a large engineering course using social network analysis," 2020, *American Society for Engineering Education, Virtual Conference*.
- [23] *S. Han, E. Grace Oh, and S. "Pil" Kang, "Social capital leveraging knowledge-sharing ties and learning performance in higher education: Evidence from social network analysis in an engineering classroom," *AERA Open*, vol. 8, p. 23328584221086664, Jan. 2022, doi: 10.1177/23328584221086665.
- [24] M. Allen, S. Dika, B. Tempest, and M. Pando, "Interactions with faculty and engineering selfefficacy among underrepresented engineering persisters," in *The Collaborative Network for Engineering and Computing Diversity Conference*, Crystal City, VA, 2018.

- [25] *Z. Boda, T. Elmer, A. Vörös, and C. Stadtfeld, "Short-term and long-term effects of a social network intervention on friendships among university students," *Sci Rep*, vol. 10, no. 1, p. 2889, 2020, doi: 10.1038/s41598-020-59594-z.
- [26] *C. Stadtfeld, A. Vörös, T. Elmer, Z. Boda, and I. J. Raabe, "Integration in emerging social networks explains academic failure and success," *Proceedings of the National Academy of Sciences*, vol. 116, no. 3, p. 792, 2019, doi: 10.1073/pnas.1811388115.
- [27] Elliott, J., "Understanding Peer Interactions in Undergraduate Engineering Education," All Graduate Theses and Dissertations, Fall 2023 to Present, Utah State University, Logan, UT, 2024. doi: https://doi.org/10.26076/a8d4-e19c.
- [28] *S. Ma, G. L. Herman, M. West, J. Tomkin, and J. Mestre, "Studying STEM Ffaculty communities of practice through social network analysis," *J Higher Educ*, p. 27, 2019, doi: 10.1080/00221546.2018.1557100.
- [29] M. Dado and D. Bodemer, "Methodological Reviews: A review of methodological applications of social network analysis in computer-supported collaborative learning," *Educ Res Rev*, vol. 22, pp. 159–180, 2017, doi: 10.1016/j.edurev.2017.08.005.
- [30] M. J. Grant and A. Booth, "A typology of reviews: an analysis of 14 review types and associated methodologies," *Health Info Libr J*, vol. 26, no. 2, pp. 91–108, 2009, doi: https://doi.org/10.1111/j.1471-1842.2009.00848.x.
- [31] M. L. Rethlefsen *et al.*, "PRISMA-S: an extension to the PRISMA Statement for Reporting Literature Searches in Systematic Reviews," *Syst Rev*, vol. 10, no. 1, p. 39, Dec. 2021, doi: 10.1186/s13643-020-01542-z.
- [32] Elliott, J., and Nielson, A, "Work in Progress: A Scoping review of social network analysis methods in engineering education," in *2024 Rocky Mountain Section Conference Proceedings*, ASEE Conferences, 2024. doi: 10.18260/1-2-1114-49420.
- [33] J. Saldana, Coding Manual for Qualitative Researchers. SAGE Publications, 2009. [Online].
- [34] B. K. Jesiek, L. K. Newswander, and M. Borrego, "Engineering education research: Discipline, community, or field?," *Journal of Engineering Education*, vol. 98, no. 1, pp. 39–52, Jan. 2009, doi: 10.1002/j.2168-9830.2009.tb01004.x.
- [35] J. E. Froyd, P. C. Wankat, and K. A. Smith, "Five major shifts in 100 years of engineering education," *Proceedings of the IEEE*, vol. 100, no. Special Centennial Issue, pp. 1344–1360, 2012.
- [36] Y. Huang and R. Tian, "Lead–lag effect of research between conference papers and journal papers in data mining," *WIREs Data Mining and Knowledge Discovery*, vol. 14, no. 6, Nov. 2024, doi: 10.1002/widm.1561.

- [37] M. McPherson, L. Smith-Lovin, and J. M. Cook, "Birds of a feather: Homophily in social networks," *Annu Rev Sociol*, vol. 27, no. 1, pp. 415–444, 2001, doi: 10.1146/annurev.soc.27.1.415.
- [38] I. Smirnov and S. Thurner, "Formation of homophily in academic performance: Students change their friends rather than performance," *PLoS One*, vol. 12, no. 8, p. e0183473, Aug. 2017, doi: 10.1371/journal.pone.0183473.
- [39] B. Hughes and S. Watson, "Someone like you: Theorizing LGBTQ participation in engineering through network homophily and state authenticity," in *2023 ASEE Annual Conference & Exposition Proceedings*, ASEE Conferences. doi: 10.18260/1-2--44244.
- [40] T. Fischer and J. Rode, "Classroom or pub Where are persistent peer relationships between university students formed?," *J Econ Behav Organ*, vol. 178, pp. 474–493, 2020, doi: https://doi.org/10.1016/j.jebo.2020.07.019.
- [41] B. Berhane, "Networking 101: Exploring within-group differences between high-achieving Black African and Black American engineering community college student peer groups," *Journal of African American Males in Education*, vol. 8, no. 1, p. 25, 2017.
- [42] N. Pearson, J. Major, A. Godwin, and A. Kirn, "Using social network analysis to study the social structures of inclusion," in *ASEE annual conference & exposition*, 2018.
- [43] M. Bastian, S. Heymann, and M. Jacomy, "Gephi: an open-source software for exploring and manipulating networks," 2009.
- [44] S. P. Borgatti, "Social Network Analysis, Two-Mode Concepts in," in *Encyclopedia of Complexity and Systems Science*, R. A. Meyers, Ed., New York, NY: Springer New York, 2009, pp. 8279–8291. doi: 10.1007/978-0-387-30440-3_491.
- [45] *R. Ellis, F. Han, and A. Pardo, "When does collaboration lead to deeper learning? Renewed definitions of collaboration for engineering students," *IEEE Transactions on Learning Technologies*, vol. 12, no. 1, pp. 123–132, 2019, [Online]. Available: http://dist.lib.usu.edu/login?url=http://search.ebscohost.com/login.aspx?direct=true&db=eric&A N=EJ1212493&site=eds-live
- [46] *T. Castillo, R. F. Herrera, T. Guffante, Á. Paredes, and O. Paredes, "The Interaction of Civil Engineering Students in Group Work through the Social Network Analysis," *Sustainability*, vol. 13, no. 17, p. 9847, 2021, doi: 10.3390/su13179847.
- [47] *K. Jablokow and P. Vercellone-Smith, "The Impact of Cognitive Style on Social Networks in On-Line Discussions," *Adv Eng Educ*, pp. 1–29, 2011.
- [48] *S. Snyder, D. Ozkan, D. Bairaktarova, T. Staley, and S. Biscotte, "Teaching across boundaries: Examining the institutional process of establishing multidisciplinary courses," in ASEE Annual Conference & Exposition Proceedings, 2019. doi: 10.18260/1-2–33339.

- [49] *M. Vujovic, I. Amarasinghe, and D. Hernández-Leo, "Studying collaboration dynamics in physical learning spaces: Considering the temporal perspective through epistemic network analysis," *Sensors*, vol. 21, no. 9, 2021, doi: 10.3390/s21092898.
- [50] *L. Berhan, A. Adams, W. McKether, and R. Kumar, "Social networks analysis of African American engineering students at a PWI and an HBCU – A Comparative study," in ASEE Annual Conference & Exposition Proceedings, 2019. doi: 10.18260/1-2–32253.
- [51] *R. Vivian and A. Barnes, "Social networking: from living technology to learning technology?," in *ascilite Sydney*, 2010.
- [52] *N. Navick and M. K. Feister, "Social network analysis of in-group biases with engineering project teams," in ASEE Annual Conference & Exposition Proceedings, 2019. doi: 10.18260/1-2–32286.
- [53] *J. Middleton *et al.*, "Social network analysis of faculty connections in a multi-year professional development program," in *ASEE Annual Conference & Exposition Proceedings*, 2018. doi: 10.18260/1-2–30971.
- [54] *H. J. Teo, "Social motif analytics: network building blocks for assessing participation in an online engineering community," in ASEE Annual Conference & Exposition Proceedings, 2014, pp. 24.1088.1-24.1088.10. doi: 10.18260/1-2–23021.
- [55] *B. Novoselich and D. Knight, "Shared leadership in mechanical engineering-centric capstone design teams: A Comparison of military and civilian engineering programs," in *ASEE Annual Conference & Exposition Proceedings*, 2016. doi: 10.18260/p.26180.
- [56] *C. Vogiatzis, S. Teixeira-Poit, T. Walton, G. Gowdy, and B. Ram, "Research engineer network: A Network analysis of graduate student relationships," in ASEE Virtual Annual Conference Content Access Proceedings, 2021. doi: 10.18260/1-2–37666.
- [57] *A. Khaled, S. Ouchani, and C. Chohra, "Recommendations-based on semantic analysis of social networks in learning environments," *Comput Human Behav*, vol. 101, pp. 435–449, 2019, doi: 10.1016/j.chb.2018.08.051.
- [58] *M. Borrego, L. Osborne, R. Streveler, K. Smith, and R. Miller, "Quantitative and qualitative measures of community development through a structured workshop curriculum," in *Annual Conference & Exposition Proceedings*, 2007. doi: 10.18260/1-2–1596.
- [59] *E. Battistoni and A. F. Colladon, "Personality correlates of key roles in informal advice networks," *Learn Individ Differ*, vol. 34, pp. 63–69, 2014, doi: 10.1016/j.lindif.2014.05.007.
- [60] *D. Zhao, D. Simmons, and M. Duva, "Measuring students' class-level sense of belonging: A Social-network-based approach," in ASEE Annual Conference & Exposition Proceedings, 2019. doi: 10.18260/1-2–33093.

- [61] *J. Righter and J. Summers, "Leadership and communication network identification and analysis with dependency structure matrices in senior design teams," in *ASEE Virtual Annual Conference Content Access Proceedings*, 2021. doi: 10.18260/1-2–37421.
- [62] *M. F. Filho and P. Panzarasa, "Knowledge transfer within affiliation networks," in *IEEE International Engineering Management Conference*, 2006, pp. 226–230. doi: 10.1109/IEMC.2006.4279853.
- [63] *T. T. Yuen and T. A. Pickering, "Investigation of social networks and discussions in STEM education communities on Twitter," in *International Conference on Learning and Teaching in Computing and Engineering*, IEEE, Jan. 2015, pp. 128–133. doi: 10.1109/LaTiCE.2015.20.
- [64] *R. F. Herrera, F. M.-L. Rivera, and J. C. Vielma, "Interaction networks within student teams learning Building Information Modeling (BIM)," *Journal of Civil Engineering Education*, vol. 147, no. 1, 2021, doi: 10.1061/(ASCE)EI.2643-9115.0000032.
- [65] *A. Gardner, K. Willey, and Q. Meng, "Insights from using a subject-specific Facebook group for student engagement and learning," in *6th Research in Engineering Education Symposium: Translating Research into Practice*, 2015.
- [66] *J. Zhang, R. Li, H. Li, M. Skitmore, and P. Ballesteros-Pérez, "Improving the innovation ability of engineering students: a Science and Technology Innovation Community organisation network analysis," *Studies in Higher Education*, vol. 46, pp. 1–15, 2019, doi: 10.1080/03075079.2019.1659761.
- [67] *S. Korkmaz and A. Singh, "Impact of team characteristics in learning sustainable built environment practices," *Journal of Professional Issues in Engineering Education and Practice*, vol. 138, no. 4, pp. 289–295, 2012, doi: 10.1061/(ASCE)EI.1943-5541.0000107.
- [68] *S. Gunawardena and K. Kecskemety, "Gender differences in first-year engineering: Peer connections in the time of COVID-19," in ASEE Annual Conference & Exposition Proceedings, ASEE Conferences, 2022. doi: 10.18260/1-2-41729.
- [69] *R. Y. Y. Chan, J. Huang, D. Hui, S. Li, and P. Yu, "Gender differences in collaborative learning over online social networks: Epistemological beliefs and behaviors," *Knowledge Management & E-Learning: An International Journal*, pp. 234–250, 2013, doi: 10.34105/j.kmel.2013.05.017.
- [70] *A. Marshall and R. Gamble, "Gauging influence in software development teams," in *IEEE Frontiers in Education Conference (FIE)*, 2015, pp. 1–8. doi: 10.1109/FIE.2015.7344106.
- [71] *V. Matthew, T. Monroe-White, and S. Engelman, "Fostering institutional change in innovation and entrepreneurship: A Social network analysis approach," in *ASEE Annual Conference & Exposition Proceedings*, 2016. doi: 10.18260/p.26946.
- [72] *R. Y.-Y. Chan, K. M. Ho, S. Jia, Y. Wang, X. Yan, and X. Yu, "Facebook and information security education: What can we know from social network analyses on Hong Kong engineering

students?," in *IEEE International Conference on Teaching, Assessment, and Learning for Engineering (TALE)*, IEEE, 2016, pp. 303–307. doi: 10.1109/TALE.2016.7851811.

- [73] *F. Cima, P. Pazos, and A. M. Canto, "Exploring the relationship between teamwork skills and team members' centrality," in *IISE Annual Conference*, Engineering Management & Systems Engineering Faculty Publications Old Dominion University, 2020.
- [74] *R. J. Benbow and Y.-G. Lee, "Exploring student service member/veteran social support and campus belonging in university STEMM fields," *J Coll Stud Dev*, vol. 63, no. 6, pp. 593–610, 2022, doi: 10.1353/csd.2022.0050.
- [75] *R. Noel *et al.*, "Exploring collaborative writing of user stories with multimodal learning analytics: A Case study on a software engineering course," *IEEE Access*, vol. 6, pp. 67783– 67798, 2018, doi: 10.1109/ACCESS.2018.2876801.
- [76] *J. A. Middleton, S. Krause, K. Beeley, E. Judson, J. Ernzen, and R. Culbertson, "Examining the relationship between faculty teaching practice and interconnectivity in a social network," in *IEEE Frontiers in Education Conference (FIE)*, 2015, pp. 1–7. doi: 10.1109/FIE.2015.7344179.
- [77] *M. Zhu and M. Zhang, "Examining the patterns of communication and connections among engineering professional skills in group discussion: A network analysis approach," in *IEEE Integrated STEM Education Conference (ISEC)*, IEEE, 2016, pp. 181–188. doi: 10.1109/ISECon.2016.7457527.
- [78] *S.-C. Lin, "Evolution of civil engineering students' friendship and learning networks," *Journal of Professional Issues in Engineering Education and Practice*, vol. 144, no. 4, 2018, doi: 10.1061/(ASCE)EI.1943-5541.0000390.
- [79] *J. P. Martin, A. C. Emberley, K. Douglas, and R. Soto-Perez, "Engineering students' social networks and alters during the COVID-19 pandemic," *International Journal of Engineering Education*, vol. 38, no. 5, pp. 1643–1659, 2022.
- [80] *S. Eneje, S. O. Sanni, and C. F. Pereira, "Engagement in a virtual learning on two social networks of an engineering course using the Social Network Analysis- An approach using a case study," in *IEEE Canadian Conference on Electrical and Computer Engineering (CCECE)*, 2020, pp. 1–6. doi: 10.1109/CCECE47787.2020.9255723.
- [81] *S. Uddin and M. J. Jacobson, "Dynamics of email communications among university students throughout a semester," *Comput Educ*, vol. 64, pp. 95–103, 2013, doi: 10.1016/j.compedu.2013.01.014.
- [82] *X. Lu, X. W. Liu, and W. Zhang, "Diversities of learners' interactions in different MOOC courses: How these diversities affects communication in learning," *Comput Educ*, vol. 151, p. 103873, 2020, doi: 10.1016/j.compedu.2020.103873.
- [83] *N. Hunsu, D. Simmons, S. Brown, and O. Adesope, "Developing an instrument of classroom social engagement," in ASEE Annual Conference & Exposition Proceedings, 2018. doi: 10.18260/1-2–30298.

- [84] *J. Middleton *et al.*, "Connections among university faculty engaged in the first two years of engineering and their impact on faculty attitudes and practice," in *ASEE Annual Conference & Exposition Proceedings*, 2016. doi: 10.18260/p.26573.
- [85] *A. Knutas, J. Ikonen, and J. Porras, "Communication patterns in collaborative software engineering courses," in *Proceedings of the 13th Koli Calling International Conference on Computing Education Research*, ACM, Jan. 2013, pp. 169–177. doi: 10.1145/2526968.2526987.
- [86] *C.-N. Chang, D. Allaire, D. Fowler, R. Arróyave, and C. Lavadia, "Assessing student interdisciplinarity: Results from an interdisciplinary graduate program in science and engineering fields," in ASEE Annual Conference & Exposition Proceedings, 2018. doi: 10.18260/1-2–29823.
- [87] *R. J. Oskouei, "Analyzing different aspects of social network usages on students' behaviors and academic performance," in *International Conference on Technology for Education*, IEEE, 2010, pp. 216–221. doi: 10.1109/T4E.2010.5550097.
- [88] *R. Ruane, R. Chiou, T.-L. Tseng, and S. Mayne-DeLuca, "Analysis of online collaboration among undergraduate engineering technology students in green energy manufacturing," in *ASEE Annual Conference & Exposition Proceedings*, 2017. doi: 10.18260/1-2–27589.
- [89] *S.-C. Lin, "A Study of the characteristics of NQU students' social and learning networks," *Contemporary Educational Research Quarterly*, vol. 22, no. 1, pp. 127–168, 2014.
- [90] *O. Cimenler, K. A. Reeves, and J. Skvoretz, "An evaluation of collaborative research in a college of engineering," *J Informetr*, vol. 9, no. 3, pp. 577–590, 2015, doi: 10.1016/j.joi.2015.05.003.
- [91] *D. Jackson and S. Abdulla, "A Study on social networking among engineering freshmen," in *ASEE Annual Conference & Exposition Proceedings*, 2007. doi: 10.18260/1-2–2864.
- [92] *J. A. Middleton *et al.*, "A Social network analysis of engineering faculty connections: Their impact on faculty student-centered attitudes and practices," *Educ Sci (Basel)*, vol. 12, no. 2, p. 108, 2022, doi: 10.3390/educsci12020108.
- [93] *K. M. Turetsky, V. Purdie-Greenaway, J. E. Cook, J. P. Curley, and G. L. Cohen, "A psychological intervention strengthens students' peer social networks and promotes persistence in STEM," *Sci Adv*, vol. 6, no. 45, Jan. 2020, doi: 10.1126/sciadv.aba9221.
- [94] *K. Stresau and M. Steiner, "A Framework for developing a deeper understanding of the factors that influence success and failure in undergraduate engineering capstone design experiences," in ASEE Virtual Annual Conference Content Access Proceedings, ASEE Conferences, 2020. doi: 10.18260/1-2-33948.
- [95] *D. Lee, R. Rothstein, A. Dunford, E. Berger, J. F. Rhoads, and J. DeBoer, "Connecting online': The structure and content of students' asynchronous online networks in a blended engineering class," *Comput Educ*, vol. 163, Jan. 2021, doi: 10.1016/j.compedu.2020.104082.

[96] *Z. Sun, R. Liu, L. Luo, M. Wu, and C. Shi, "Exploring collaborative learning effect in blended learning environments," *J Comput Assist Learn*, vol. 33, no. 6, pp. 575–587, Dec. 2017, doi: 10.1111/jcal.12201.