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Promoting Sense of Belonging and Interest in Geosciences among Undergraduate Women

through Mentoring

Wenyi Du

Thesis submitted

to the College of Education and Human Services

at West Virginia University

in partial fulfillment of the requirements for the degree of

Master of Art in

Program Evaluation & Research

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Key words: sense of belonging, mentor, interest development, college female

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ABSTRACT

Promoting Sense of Belonging and Interest in Geosciences among Undergraduate Women through Mentoring

Wenyi Du

The purpose of this study is to investigate whether students' university sense of belonging mediates the relationship between mentor network diversity and students' interest development among undergraduate women in STEM majors. The sample for this study was consisted of 277 undergraduate women majoring in a STEM discipline with initial interests in geosciences across nine universities within the United States. A regression-based mediation analysis was performed using the Hayes' (2013) macro to test the indirect effect of mentor support on interest through university sense of belonging. Consistent with our hypothesis, the analysis revealed a statistically significant and positive indirect effect of the mentor network diversity on interest in geoscience through university sense of belonging, $a \times b = .04$, 95% CI = [.01,.08]. More specifically, the mentors network diversity positively predicts university sense of belonging (B = 0.19, p < .05), and in turn university sense of belonging positively predicts university sense is students' interest in geoscience (B = 0.20, p < .05). These results imply that undergraduate women's interests can be aroused and maintained through their increased sense of belonging, which can be satisfied by diversifying their mentor network resources.

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Promoting Sense of Belonging and Interest in Geosciences among Undergraduate Women through Mentoring

Introduction

Environmental issues such as increase sea-level, polluted air, and polluted marine environment, have attracted national and international attention. These urgent issues require having qualified people in geoscience fields to minimize or solve environmental problems. As classified by the National Science Foundation (2008), geosciences included a large variety of disciplines, such as Geography, Marine Sciences, Solid and Water Sciences and 19 other majors (See Appendix A).

Women have been historically underrepresented in science, technology, engineering, and mathematic (STEM) disciplines (NSF, 2017). Women are entering higher education institutions at higher rates due to numerous recruitment efforts (NSF, 2017). In disciplines, such as Behavioral Sciences and Biology, the percentage of undergraduate women is equivalent or greater than that of men. However, woman do not enter, and women leave at higher rates in some STEM fields, such as the geosciences (NSF, 2017; Bernard & Cooperdock, 2018). The percentage of undergraduate women in the Earth and Environmental sciences has increased over time, peaking in 2004 at 49% (American Geoscience Institution, 2016; Chen, 2013). But by 2017, the percentage of woman in geosciences majors dropped to 38.6% (NSF, 2017; Bernard & Cooperdock, 2018).

Woman potentially interested in geoscience-related careers can face numerous barriers, such as negative gender stereotypes or perceived incongruity of social values that can threaten their interest to enter or stay in geoscience majors (Chen, 2013). Mentoring has been identified

as an important element of comprehensive interventions to reduce the barriers for females' persistence in STEM fields (Syed, Azmitia, & Cooper, 2011; Estrada, Woodcock, Hernandez, & Schultz, 2011). In addition, research indicated a positive relationship between interest and self-efficacy, values, and academic performance (Knogler, Harackiewicz, Gegenfurtner, & Lewalter, 2015).

However, less is known about the degree to which mentoring impacts college students' interest development. The purpose of this study is to examine the direct and indirect effects of mentoring on the development of interests in the geosciences among college women in majoring in STEM. One of the most well-known interest development models was proposed by Hidi and Renninger (2006). It classified interest as four different levels: triggered situational interest, maintained situational interest, emerging individual interest, and well-developed individual interest (see Figure 1). According to Bergin's (2016) interest development model, a key factor influencing interest development is individual's social experiences, particularly individual's social supports. Social support can come from parents, friends, schools, and culture. Bergin's theory emphasizes how social supports can lead to exposure, attention to a topic, which triggers a person's situational interest (see Figure 1). As stated by self-determination theory, relatedness/ belongingness, competence, and autonomy are the three basic needs that motivate humans (Deci & Ryan, 2000). When the needs are met, interests are then supported. In this study, we focus on the needs to belong (see Figure 1).

Barriers to women's interest development in STEM

Interest is a product of the interaction between a person's internal motivation and a certain external context (Hidi & Renninger, 2006; Bergin, 1999; Renninger & Barach, 2015). The levels of interest are developed from one stage to the next sequentially with continued

exposure, consistent attention, emotional supports, and increasing stored knowledge (Hidi & Renninger, 2006; Rotgans & Schmidt, 2017; Bergin, 2016). The sequence of interest development is not necessarily shown as linear growth. But in most cases, it is an iterative convergence of multiple variables such as experiences, exposures, affordances, and performances (Bergin, 2016). Individual interest was defined as "a psychological state of engaging or the predisposition to reengage with classes of objects, events, or ideas over time." (Hidi & Renniger, 2006). The desire to engage and reengage with a certain topic has been identified as one of several internal motivation factors driving students to enter and to stay in their majors (Cheryan, Ziegler, Montoya, & Jiang, 2017; Good, Rattan, & Dweck, 2012; Hidi & Renninger, 2006; Thoman, Arizaga, Smith, Story, & Soncuya, 2015). However, when interest is threated, students can opt out of their desired career path.

For example, although approximately one third of the first-year students express initial interest in STEM majors, but their initial interests in STEM frequently do not last to their graduation. According to NCES report, about 56% of college students declared a STEM major, and abandoned the chosen STEM major in the next six years (Chen, 2013). Research found that the college dropouts occur most often in students' early-year of college (Bergin, 2016; Browning, McDermott, Scaffa, Booth, & Carr, 2018). It is important to maintain students' interest throughout their college years, particularly during their early-years of college. Many factors that contribute to the high rates of leaving STEM in early college study have been identified in previous research, including negative gender stereotypes (e.g. people are successful in STEM fields are mostly males) (Fuesting, Diekman, & Hudiburgh, 2017; Czopp, Kay, & Cheryan, 2015; Freeman, Anderman & Jensen, 2007), field-specific ability beliefs (e.g. male are more innate talented on math and science) (Bian, Leslie, Mruphy & Cimpian, 2017; Elmore &

Luna-Lucero, 2017; Ito & McPherson, 2018), or a lack of same-gender career role model (Hernandez et. al., 2018; Packard, 2003; Cheryan, Drury, & Vichayapai, 2012). For example, research indicates that women who reported experiencing gender stereotype or brilliance stereotypes expressed less sense of belonging, and less interest in STEM fields (Bian et al, 2017).

A growing body of research is focused on interventions to support women's interest in STEM fields. Empirical studies have designed interventions to increase students' interest in STEM majors by reducing stereotypes. For example, research indicates that changing the classroom environment to be less masculine can minimize gendered stereotypes of STEM majors. Perceiving a greater sense of belonging to the field can significantly increase female students' interest, persistence, and intention to pursue a career in the STEM fields (Cheryan et.al, 2010; Ito & McPherson, 2018; Lewis et. al, 2017). In addition, previous research had shown that fading the message of "fixed brilliance" or "men are more intelligent than women" helps to promote female's interest in the male-dominated fields (Bian, Leslie, Murphy, & Gimpian, 2017; Thomam, Arizaga, Smith, Story & Snocuya, 2014). Furthermore, role modeling has also been shown to be beneficial to women's interest in STEM fields (Hernandez, et. al., 2018; Cheryan et al., 2010; Cheryan, Drury, & Vichayapai, 2012).

Belongingness promotes interest development

Sense of belonging is an important psychosocial factor influencing behavior and wellbeing (Twenge, Baumeister, Tice, & Stucke, 2001, Good, Rattan & Dweck, 2012; Baumeister & Leary, 1995;). The need to belong has been conceptualized as a basic need of human beings (Baumeister & Leary, 1995; Cheryan, Sianna A. Ziegler, Amanda K. Montoya, & Lily Jiang, 2017; Walton & Cohen, 2007). Sense of belonging is built up on the interactive relationships with others. In other words, sense of belonging is defined as being accepted, valued, and legitimated within a particular group (Walton & Cohen, 2011; Keonya & Booker, 2016).

In an academic setting, the sense of belonging has been classified and studied at different levels of abstraction: class belonging (Goodenow, 1993; Midgley, Middleton, Gheen, & Kumar, 2002; Lewis et al., 2017), professor's pedagogical caring (Clinchy, 2002; Lewis et al., 2017), university belonging (Goodenow, 1993; Shook & Clay, 2012; Museus, Yi, & Saelua, 2016), and social acceptance (Walton & Cohen, 2011; Zumbrunn; Shook & Clay, 2012). According to Freeman and colleagues (2007), social acceptance, professor's pedagogical caring, and class belonging significantly and positively predict students' university sense of belonging. Thus, we will focus on students' university belonging (see Figure 1).

Sense of belonging has been positively correlated with many educational outcomes. Existing research indicates that students' sense of belonging is positively correlated to students' academic performance (e.g. GPA) (Shook & Clay, 2012; Goodenow, 1993; Hoffman, Richmond, Morrow, & Salomone, 2003), willingness to engage and reengage with the topic (Cheryan, et al., 2009; Museus, Yi, & Saelua, 2017), and to interest and intention to persist in a field of study (Hausmann, Schofield & Woods, 2007; Layous, et al., 2017).

However, an experiment conducted by Murphy and colleagues (2007) reported that students from minority groups experience belonging uncertainty and become more sensitive to belongingness than their majority peers. Women, as the minority group in the STEM fields, experience belonging uncertainty and sensitively monitor the quality of the social connections to STEM fields (Walton, 2007; Baumeister & Leary, 1995; Thoman et al., 2014). When women feel less valued, less welcomed or feel pushed away by the chilly climate in STEM, they are more likely to switch to another field or even drop out from their current fields (Hausmann, Schofield & Woods, 2007; Layous, Davis, Garcia, Purdie-Vaughns, Cook & Cohen, 2017; Thoman et al., 2014).

Mentoring promotes belonging and interest

Previous research defined the supportive relationships as mentoring. To avoid the inconsistency to the previous literature, we adopted the definition of mentoring as a progressive relationship between a person with more experience (i.e. a faculty member, a graduate student) and a person with less experience (i.e., an undergraduate student). The aim of the relationship is to support the mentee's professional development in the field (Crisp & Cruz, 2009; Jacobi, 1991; Hernandez, et al., 2017).

How does mentoring affect sense of belonging and interest development? One mechanism identified by Bergin (1999) concerns vivacious interest. Vivacious interest refers interest adaptation from social interactions with others to gain and to maintain social support (See Figure 1). According to social cognitive theories of adolescent development, at any level of schooling, students would be benefit from a supportive interaction with nonparental adults (Freeman et al., 2007; London, Rosenthal, Levy, & Lobel, 2011; Murpy et al., 2007; Museus et al., 2016).

Existing research indicates mentoring has positive impacts on students' perceived compatibility (Rosenthal, Levy & London, 2013), sense of belonging (Museus et al., 2016), interest (Shin, Levy & London, 2016; Good, Rattan & Dweck, 2012), and intention to persist (Rotgans & Schmidt, 2017; Cheryan et al., 2011; Cheryan et al., 2006), particularly when the mentees regard the mentors as their role models (Hernandez, et al., 2017). Research indicated that early-undergraduate students may have limited experience working with a faculty mentor. Instead, most of them had post-graduate level mentors, such as a master or a doctoral student

mentor (Shin, Levy & London, 2016; Aikens, Robertson, Sadselia, Watkins, Evans, Runyon, Eby, & Dolan, 2017; Twenge, Baumeister, Tice, & Stucke, 2001).

Mentoring scholars have proposed that "individuals may not rely upon only one but multiple mentoring resources to support their professional career development" (Baugh & Scandura, 1999; Thomas & Higgins). Mentor network diversity indicates how many types of mentors a mentee has access to. The mentee benefits from greater mentor network diversity through less redundant information (Higgins & Kram, 2001). Hence, in this study, the mentor network diversity was defined as the total number of different mentor sources, such as, one's academic advisor, master and doctor student mentors, tie to the mentee's network within the university.

In addition to the types of mentor, research indicates that the gender of the mentor may influence the quality of mentorship. Mentoring theories illuminate that female undergraduate students may benefit from having same-gender mentors more compared to having differentgender mentors in the STEM fields (Lockwood, 2006; Blake-Beard, Bayne, Crosby & Muller, 2011). Empirical studies indicated that having a same-gendered mentor may increase women's perceived compatibility, perceived similarity, sense of belonging, and coauthoring experience in STEM fields (Cheryan et al., 2006; Rosenthal, Levy & London, 2013; Hernandez, et al., 2017).

Overview of the Study

The current study focuses on the effects of different aspects of mentoring on university sense of belonging and interest development. Undergraduate students may have more than one type of mentor and may benefit from the mentor network diversity. Based on the mentoring theory and empirical studies, faculty mentors may promote at least three outcomes: coauthoring experiences, perceived identity similarity, and sense of belonging. Peer and other source of mentoring may provide support to students' sense of belonging towards the institution or towards the fields (Hoffman et al., 2003; Johnson, 2013; Museus et al., 2016; Kivlighan et al., 2018).

The purpose of this study is to examine the direct and indirect effects of mentoring relationships on the interest development in geosciences among college women in STEM. This study will fill the gap of how the university sense of belonging is impacted by mentor network diversity and having a gender-matched faculty mentor, and how belonging may in turn affect women's interest in geosciences. Data for this study were drawn from a larger study of female STEM students' academic journeys, entitled the "Analysis of Women's Advancement, Retention, and Education in Science (AWARES)". The AWARES study longitudinally follows a sample of college women recruited from nine universities in two regions of the United States: Colorado, Wyoming (the Front Range), and North and South Carolina (the Carolinas) since Fall 2015. First or second-year of undergraduate women in STEM majors (or those intending to pursue STEM major) were recruited to participate in the AWARES study. Approximately half of the AWARES study participants participated in a professional development and mentoring program (i.e., PROGRESS program). Online surveys were distributed every semester since Fall 2015 to collect data.

Previous research has shown positive effects of mentoring support on undergraduate students' general social sense of belonging (i.e. peer belonging) (Goodnow, 1993; Freeman, Anderman, & Jensen, 2007; Thoman, Arizaga, Smith, Story, & Soncuya, 2015; Ribera, Miller, & Dumford, 2017). However, less is known about the effect of a student's mentor network diversity on their sense of belonging to their university. Furthermore, Hernandez and his colleagues (2016) found that undergraduate students with same-gender faculty had reported more co-authoring experiences than with same gender mentors. However, there is limited research

showing that female undergraduate students' sense of belonging would be affected by the gender of their faculty mentors. In addition, previous research has shown the science identity (Herenandez et al., 2017), perceived similarity (Cheryan & Plaut, 2010), and utility value (Hulleman & Harackiewicz, 2009; Harackiewicz, Canning, Tibbetts, Priniski, & Hyde, 2016) can mediate the relationship between mentoring and students' interest. Moreover, there is less research on the role of university sense of belonging as a mediator in the relationship between mentor network diversity and interest. To fill these gaps, this study aimed to answer the following research and hypotheses.

Research Questions and Hypotheses

Does sense of belonging mediate the relationship between mentor network diversity or having a gender-match faculty mentor and interest in geosciences? Three hypotheses were proposed as the following:

- Mentor network diversity and having a gender-matched faculty mentor would positively predict women's university sense of belonging;
- 2. University sense of belonging would positively predict women's interest in geosciences;
- Mentor network diversity and having a gender-matched faculty mentor would positively predict women's interest in geosciences.

Methods

Participants

The overall sample of the AWARES study consisted of 484 female undergraduate students. In Fall 2018, 386 participants took the survey, while 98 did not take the survey. A Pearson's chi-square test was conducted based on the recruiting survey to test the differences between the participants who took the survey in Fall 2018 and these who did not. The result revealed there was no significant differences between the two groups based on year in school (χ^2 = .87, df = 3, p = .83), recruitment cohort (χ^2 = .87, df = 3, p = .83), race (χ^2 = 1.72, df = 1, p= .19), or their interest participating in a longitudinal research study ($F_{(1, 482)}$ =.09, p =.77). However, the PROGRESS member students showed higher completion rate than these who were not in the mentoring program (χ^2 = 13.12, df = 1, p <.01).

Among 386 participants took the survey (see Table 1), 86 participants were removed because they were no longer undergraduate students, and 23 participants were removed during the regression analysis using list-wise deletion due to missing at least one of the variables. A total of 277 participants were included in the data analysis.

Procedure

The participants were initially recruited via email (i.e., email addresses obtained from university registrar office), in-person recruiting announcement in the introductory STEM courses (e.g., Physics 101), and recruitment flyer posted across the campuses. Students interested in participating in the study completed a screening survey and received gifts for their efforts (\$5 Starbucks card). Only students who met the following criteria were invited to participate in the study: first- or second- year of college, identify as female, intention to have a STEM major, and interested in geosciences. Participants were recruited from nine universities in the Colorado/Wyoming Front Range and the Carolinas. The participants were recruited as two cohorts: Fall 2015 and Fall 2016. About 50% of the participants attended to the mentoring weekend workshops (e.g. PROGRESS). Participants were invited to complete longitudinal follow-up surveys thereafter (Fall & Spring) till Spring 2019. Data collection has been performed using Qualtrics, an online survey system. Participants received either \$10 e-Gift card or \$10 direct deposit to their PayPal account for their participation. All procedures were approved by the local IRB. The data used in this study was collected in Spring and Fall 2018.

Measures

Mentor network diversity. Participants were given the following definition of mentoring: "A mentor is someone who provides guidance, assistance, and encouragement on professional and academic issues. A mentor is more than an academic advisor and is someone you turn to for guidance and assistance beyond selecting classes or meeting academic requirements." With that definition in mind, participants were asked: "1) if there is faculty member, 2) a graduate student, 3) a peer, or 4) other university faculty member that they would consider as a mentor?". The participants' responses to each category mentor were dummy coded into 1 (Yes) and 0 (No). This variable presented the sum of all types of mentors. This variable ranged from zero to four. The mentor network diversity variable data was collected during Spring 2018.

Gender-matched faculty mentor. If the participants report having a faculty mentor, follow-up question asked the gender of their faculty mentor. This variable was dummy coded into 0 (not gender-matched) and 1 (gender-matched). Both "Woman/Female" and "Transgender woman" gender identities were coded as "1".

University sense of belonging. University sense of belonging was measured with eightitems adapted from Shook and Clay (2012). Participants reported their perceived sense of belonging to their university (e.g. "I am enthusiastic about attending my university.") on a sevenpoint Likert scale from strongly disagree (1) to strongly agree (7). The scale scores were derived by taking the average of the eight items, with a higher score indicating the higher level of university sense of belonging. University sense of belonging scores have exhibited high internal

consistency reliability in the previous research (Cronbach's $\alpha = .92$) (Shook & Clay, 2012). Data of university sense of belonging was collected in the survey of Fall 2018.

Interest in the geosciences. Students' interest in geosciences was measured with a twoitem measure adapted from the prior literature of interest development (Hulleman & Harackiewicz, 2009). Participants rated their level of interests to each of the following: 1) "How interested are you in taking courses in Earth Systems or Environmental Sciences?" and 2) "How interested are you in pursuing an Earth Systems or Environmental Sciences Career?" on a sevenpoint Likert scale from not at all interested (1) to very interested (7). Scales scores were derived by taking the average of the two items, with a higher score indicating a higher level of interest in the geosciences. The interest scales had exhibited a high internal consistency reliability in previous research (Cronbach's $\alpha = .86$) (Hernandez et al., 2017). The interest in the geosciences measure was collected on both the initial recruitment survey (i.e., Fall 2015 or 2016) and in the Fall 2018 survey.

Control variables

PROGRESS membership. The participants in this study did or did not participant in the PROGRESS program. Their membership was dummy coded as PROGRESS member (1) or non-PROGRESS membership (0).

University. Students from nine universities participated in this study: Colorado College, Colorado State University, Metro State University Denver, North Carolina A&T, North Carolina State University, University Colorado – Boulder, University of North Carolina – Charlotte, University of South Carolina, and University of Wyoming. The university variable was dummycoded with Colorado State University as the reference group. Cohort statues. The cohort statues refer which year the student had been recruited.

Cohort has been dummy-coded as 1 (Fall 2015, cohort 1) and 0 (Fall 2016, cohort 2) as a control variable.

Statistical assumptions and preliminary analyses

Prior to running regression and mediation analyses, the data were examined for outliers, missing data severity, and regression assumptions in SPSS software version 25. There was no evidence indicating extreme outliers (e.g., leverage, Cook's D values were acceptably small; Judd, McClelland, & Ryan, 2009). The pattern of missing data were consistent with the restrictive assumption of missing completely at random (e.g., Little's MCAR test was not significant, $\chi^2 = 10.96$, df = 11, p = .45). And the assumptions of regression were met (e.g., Q-Q plots showed normality for most of the variables). Finally, we tested the independence assumption was due to the students being nested within universities. The clustering effects were examined using HLM software student version 7.03. The ICC presented the proportion of variance between universities to the total variance. The ICC revealed the variances of interests in geosciences located mainly among individuals (ICC_{interest} = .01) and the variance of university sense of belonging was also mainly explained at the individual level (ICC_{belongingness} = .07). The ICC for sense of belonging was non-ignorable. Thus, we included universities as covariates in mediation analysis.

Results

Intercorrelations

The goal of this study was to examine university sense of belonging as a mediator between mentoring and interest in geosciences. Specifically, we examined mentoring from two aspects: 1) mentor network diversity and 2) having a gender-matched faculty mentor. Prior to conducting formal mediation hypothesis tests, the pattern of associations were examined.

An intercorrelation analysis revealed that students' university sense of belonging was positively and significantly correlated with students' initial interest in geosciences, having a faculty mentor, and mentor network diversity. And students' interest in geosciences was significantly and positively correlated with cohort, having a faculty mentor, having a gendermatched faculty mentor, mentor network diversity, students' university sense of belonging, and moderately correlated with students' initial interest in geosciences. With a small portion of participants reported having a gender-matched faculty mentor, a significantly positive correlation between having a gender-matched faculty mentor and interest in geosciences was found (see Table 2).

Mediation analyses

Two hierarchical regression analyses were conducted to predict interest separately with two predictors: 1) mentor network diversity and 2) gender-matched faculty mentor. The variance of students' university sense of belonging was significantly explained by mentor network diversity, but not by having a faculty mentor. The variance of students' interest in geosciences was significantly explained by university sense of belonging, mentor network diversity, but not by having a gender-matched faculty mentor. (see Table 3 & Table 4).

With these results above, mediation analyses were performed to formally address the research question and hypotheses. The Hayes' (2013) macro was used to test the mediation effect of university sense of belonging on the relationship between mentor network diversity and interest in the geosciences, controlling for university, PROGRESS membership, cohort and initial interest in the geosciences. The mediation analysis was performed (PROCESS Model 4)

with 20,000 bootstrapped samples to construct 95% confidence intervals (CIs) around the indirect effect. Consistent with our hypothesis, students with more mentor network diversity reported higher university sense of belonging (B = .19, SE = .05, 95% CI = [.09, .31]). Students with higher university sense of belonging expressed higher interest in geosciences (B = .20, SE = .10, 95% CI = [.0004, .40]). The analysis revealed a statistically significant and positive indirect effect of mentor network diversity on interest in the geoscience through university sense of belonging, $a \times b = .04$, 95% CI = [.01, .08]. The partially standardized effect size ($\beta = .04$) indicated that student having one more mentor expressed .04-standard deviation higher interest in geosciences, as a result of the effect of mentor network diversity on university sense of belonging (see Figure 2).

The mediation test for having a gender-matched faculty mentor was unnecessary, on interest in the geosciences through university sense of belonging. The results indicated that students having a gender-matched faculty mentor reported was not predictive of with university sense of belonging, although sense of belonging was still predictive of interest in the geosciences, Table 4. The analysis revealed a positive but not statistically significant indirect effect of the gender-matched faculty mentor on interest in the geoscience through university sense of belonging, $a \times b = .03$, 95% CI = [-.12, .33].

Discussion

This study was designed to investigate if mentor network diversity and gender-matched faculty mentor impact female undergraduate students' university sense of belonging, which in turn may affect their interest in geosciences. First, consistent with our hypothesis, university sense of belonging positively mediated the relationship between mentor network diversity and interest in geosciences. Precisely, higher mentor network diversity predicted higher university sense of belonging, consecutively, higher university sense of belonging predicted higher interest in geosciences. Second, though the university sense of belonging did not mediate the relationship between having a gender-matched faculty mentor as our hypothesized, the correlation analysis reveals that students' interest in geoscience is positively correlated with having a gendermatched faculty mentor.

Significance of The Study

These findings are consistent with previous studies in that a) interest was predicted by students' sense of belonging (Thoman et al., 2014; Goodenow,1993) and b) mentoring positively impacted students' interest (Hernandez et al., 2017). But this study extends STEM mentoring and interest development literature in two important ways. First, instead of using one mentoring source as the primary predictor, this study used mentor network diversity to examine the total effect of mentoring. It provided a conceptual lens to boost students interest development by varying the ways accessing different types of mentoring. Second, university sense of belonging was empirically examined as the mediator of mentor network diversity and interest development, which has not been done by previous research.

Limitations

Though this study extended women's interest development and mentoring literature in STEM in different ways, there are several limitations need to be noted. First, the limitation of the sample. The prime limitation was that participants in this study were not randomly sampled, but were rather a sample of first- and second-year female undergraduate STEM majors interested in the geosciences. In addition, a majority of the participants were in the third or the fourth year of the college at the time we collected the data for this study. As documented in previous research,

students in the third or fourth year of college may have higher sense of belonging to their university than early-year college students (Good, Rattan, & Dweck, 2012; Freeman et al., 2007). In addition, we did not measure the participants' initial university sense of belonging on the early data collection survey. Further, only a small portion of participants were actually majoring in geosciences, but we used students' interest in geosciences as our predicted outcome. Even only 21.9% of the sample majored in geosciences, all the participants showed initial interest in geosciences to some degree to be included in this study. Although the mean of interest in geosciences at was 4.01, which was an average score on the scale (see Table 1). A t-test revealed that there was an overall significant increase between participants' initial interest in geosciences and their interest in geosciences in Fall 2018 (t $_{(1,276)} = 8.60$, p <.01), despite their majors.

Second, the mentor network diversity was measured by the number of total mentors, which did not reflect the different roles of mentors. To better understand the components of participants' mentor network diversity, we examined the number of different types of mentors. We found that the most frequent mentoring resource were peer mentors (n = 144, 51.8 %), followed by faculty mentors (n = 136, 48.9 %) and another faculty mentor (n = 89, 32.0 %), while the least frequent mentoring type was graduate students (n = 65, 23.4 %) reported in this study. Besides, lack of information of mentors' disciplinary is another limitation in this study. Even we gave the definition of mentoring, we did not limit to or ask for the mentor's disciplinary. Thus, mentors may not be supporting geosciences interest specifically.

Practice Implications

This study focused on women in geosciences, a subfield of STEM. This model may still be applicable to other STEM majors for the following two reasons: First, it's a common

phenomenon that women face gender-based barriers to degrees and careers in STEM. In this study, it revealed a positive impact of mentoring on women's sense of belonging. Second, there are many of general required courses across STEM fields. Thus, the basic trainings are similar across early college STEM education. Students have possibility to specify or switch within STEM disciplines. For example, one of our participants entered geosciences master's program with a biology bachelor's degree.

Our findings are of use to educational psychologists and university administrates to promote women's interest development and sense of belonging through mentoring. Instead of having the number of mentors increased, universities may pay more attention on how to diversify the role of mentors. To be more specific, the mentor network diversity may be achieved by the following implications. First, a mentoring workshop may be an efficient way for students to build connections to peer mentors and faculty mentors within the university. Workshops may offer opportunities to identify the barriers women are facing in STEM, to build connections to peers with similar interest, and to be advised with research experience applications. Through the workshops, students may know mentors in-person and may maintain the relationships via social media.

Second, it's also important to encourage graduate students become mentors to undergraduate students. In this study, graduate student mentors were the lease frequent reported mentoring resource (n= 65, 23.4 %). However, comparing the ratio of faculty to undergraduate students verses the ration of graduate students to undergraduate students, it should be more accessible to have a graduate mentor than having a faculty mentor. Having graduate students as mentors may encourage undergraduate students to take one step further, such as applying for a master's degree, in related fields. Third, university may hold conferences to help students build connections to professionals outside of the university, including professors from other universities, professionals in industries. In conferences, students may get exposures to the most in trend scientific innovations, to an influential professor in the field, and to meet their "career role models". Conferences can be the window sending welcome message to women encouraging them to enter and to stay, and may help students to gain knowledge beyond textbooks, to explore unknows, and to specify their interests.

Conclusion and Future Directions

Most educational psychology research on promoting STEM diversity focus on the reasons pushed women away from the science fields. However, this study examines the phenomenon from the perspective of psychosocial view, indicating that mentoring and sense of belonging can promote women's interest development, which potentially increase their intention to stay in STEM fields. The results suggested that women benefit from multiple mentoring connections by confirming their sense of belonging. To minimize the issues gender disparities brings to STEM, this study illustrated the importance of building individual connections to promote students' experience across campus and within STEM.

In a nutshell, the results of this study insights several paths for future study. First, future researcher of mentoring would benefit from using multiple data sources, such as individual interview and focus group, to capture the precise relationship between mentor network diversity, sense of belonging and their interest development. In addition, even we know that students benefit from the mentor network diversity, but it would be interesting to investigate which source of the mentoring is most efficient way expanding the connections. Third, future study will be

needed to further explore sense of belonging towards the STEM fields. Thus, future study will answer whether the sense of belonging predicts females' actual retention in STEM fields.

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Figure 1. Theory model of mentoring support influences interest development by increasing exposure and belonging.

Table 1.

Participants' demographic information.

Characteristics	n	%
PROGRESS member	113	40.6%
Cohort I (Fall 2015)	117	42.1%
Race (European)	189	68.0%
STEM major	376	97.4%
Geoscience major	61	21.9%

Note: (N = 277). N = total sample size.

Table 2.

Summary of intercorrelations for all the variables.

Variable	1.	2.	3.	4.	5.	6.	7.	8.	9.	10.	11.	12.	13.	14.	15.	16.
1.PROGRESS	-															
2.CC	.05	-														
3.MSUD	.03	06	-													
4.NC A&T	05	06	06	-												
5.NCSU	03	10	10	10	-											
6.UCB	04	11	11	11	18**	-										
7.UNCC	.08	09	09	09	15*	16**	-									
8.USC	00	08	08	08	13*	14**	12	-								
9.UW	01	08	08	08	13*	15*	12*	11	-							
10.Cohort	.04	04	.20**	.21**	.00	14*	03	.11	06	-						
11.Interest W1	.05	.07	.05	04	03	08	03	.13*	.04	.22**	-					
12. Faculty	.15*	.16**	.05	06	01	.06	18**	.07	.03	02	.13*	-				
13.F-gender	.10	.02	.02	.03	.00	.07	05	03	.03	.08	.07	.35**	-			
14.metor div.	.13*	.06	03	04	.05	.05	13*	.00	.04	03	.07	.63**	.19**	-		
15.Belong	06	16**	.01	.04	.21**	02	11	.07	05	.03	.15*	.14*	.10	.21**	-	
16.Interest W6	.15*	.09	.12*	06	01	06	07	.06	.09	.12*	.53**	.23**	.16**	.19**	.19**	-
Ν	294	300	300	300	300	300	300	300	300	294	294	279	300	279	300	299
Mean	.40	.06	.06	.06	.12	.16	.12	.10	.09	.41	3.45	.49	.10	1.62	5.14	4.01
SD	.49	.23	.23	.24	.33	.37	.33	.30	.29	.49	1.16	.50	.30	1.22	1.15	2.13
Skew	.45	4.00	3.85	3.72	2.26	1.83	2.41	2.71	2.81	.36	-2.7	.05	2.74	.23	71	.05
Kurtosis	-1.8	14.06	12.94	12.00	3.11	1.36	3.55	5.56	5.94	-1.88	87	.15	5.56	-1.05	.40	-1.34

Note. Variable names: 1. PROGRESS membership; 2. Colorado College; 3. Metropolitan State University at Denver; 4. North Carolina A&T University; 5. North Carolina State University; 6. University of Colorado Boulder; 7. University of North Carolina – Charlotte; 8. University of South Carolina; 9. University of Wyoming; 10. Cohort; 11. Initial interest in geosciences at Wave I; 12. Having a faculty mentor; 13. Gender-matched faculty mentor; 14. Mentor diversity; 15. University sense of belonging; 16. Interest in geoscience at Wave VII. ** p < .01, * p < .05. (N = 277).

Table 3.

		Belongin	g		Interest	
Predictors	b	SE	95% CI	b	SE	95% CI
Intercept	4.30	.27	[3.76, 4.84]	77	.63	[-2.00, 0.47]
CC	84	.31	[-1.44,24]	.66	.51	[34, 1.66]
MSUD	.01	.32	[62, 64]	.98	.53	[06, 2.01]
NC A&T	.30	.31	[32, .91]	14	.51	[-1.16, .87]
NCSU	.60	.22	[.16, 1.04]	.12	.37	[61, .86]
UCB	06	.21	[47, .36]	.11	.35	[58, .80]
UNCC	21	.24	[67, .26]	04	.39	[80, .73]
USC	.22	.26	[-30, .73]	.14	.43	[71, .98]
UW	21	.25	[70, .26]	.67	.41	[13, 1.47]
PROGRESS	16	.13	[42, .11]	.48	.22	[.05, .92]
Cohort	06	.14	[35, .22]	01	.24	[48, .46]
Interest W1	.15	.06	[.04, .27]	.90	.09	[.71, 1.10]
Mentor div.	.20	.06	[.90, .31]	.19	.09	[.01, .37]
U. Belonging	-	-	-	.20	.10	[.0004, .40]

Summary of Hierarchical Regression with Mentor Diversity Predicting University Sense of Belonging and interest at W6 (N = 277).

Note. Mentor diversity predict university sense of belonging ($\Delta R^2 = .04$, p <.01); University sense of belonging explained significant amount of variance of interest ($\Delta R^2 = .01$, p < .05). * p <.05, ** p < .01.

Table 4.

		Belonging		Interest			
Predictors	b	SE	95% CI	b	SE	95% CI	
Intercept	4.45	.27	[3.91, 4.98]	68	.63	[-1.91, 0.55]	
CC	88	.31	[-1.50,26]	.59	.51	[42, 1.60]	
MSUD	.02	.32	[62, .66]	.97	.53	[06, 2.00]	
NC A&T	.32	.32	[31, .94]	11	.51	[-1.12, .91]	
NCSU	.64	.23	[.20, 1.09]	.16	.37	[58, .89]	
UCB	05	.22	[48, .37]	.08	.35	[61, .77]	
UNCC	20	.24	[67, .27]	.01	.39	[75, .77]	
USC	.21	.27	[32, .72]	.12	.43	[73, .96]	
UW	20	.25	[69, .30]	.67	.41	[13, 1.47]	
PROGRESS	15	.14	[42, .12]	.46	.22	[.02, .89]	
Cohort	08	.15	[21, .37]	04	.24	[43, .50]	
Interest W1	.15	.06	[.01, .03]	.89	.10	[.70, 1.08]	
Faculty mentor	-31	.15	[.02, .60]	.39	.24	[09, .86]	
Gender-matched	.20	.23	[25, .66]	.47	.38	[28, 1.20]	
Uni. belonging	-	-	-	.20	.10	[.01, .40]	

Summary of Hierarchical Regression with Gender-matched Faculty Mentor Predicting Sense of Belonging and Interest at W6 (N = 277).

Note. Gender-matched faculty mentor predicts university sense of belonging ($\Delta R^2 = .01, p > .05$); University sense of belonging predicts interest ($\Delta R^2 = .01, p < .05$). * p < .05, ** p < .01.



Figure 2. Mediation Analysis. The Effect of Mentor Diversity on Interest in the Geosciences through University Sense of Belonging.

Note. Included the following covariable in mediation analysis: 1. PROGRESS membership; 2. Colorado College; 3. Metropolitan State University at Denver; 4. North Carolina A&T University; 5. North Carolina State University; 6. University of Colorado Boulder; 7. University of North Carolina – Charlotte; 8. University of South Carolina; 9. University of Wyoming; 10. Cohort; 11. Initial interest in geosciences.

Appendix A: List of Geoscience Majors

- 1. Atmospheric and Oceanic Science
- 2. Ecosystem Science and Sustainability
- 3. Ecology
- 4. Earth Science
- 5. Environmental Chemistry
- 6. Environmental Science
- 7. Environmental Studies
- 8. Environmental Policy
- 9. Environmental technology and management
- 10. Ecosystem Science and Sustainability
- 11. Geological and Earth Sciences/Geoscience
- 12. Geology
- 13. Geophysics
- 14. Geology/Earth Science, General
- 15. Geophysics
- 16. Marine and Coastal Resources
- 17. Marine Science
- 18. Meteorology/atmospheric science/Climatology
- 19. Oceanography
- 20. Soil and crops science
- 21. Watershed Science/ Hydrology

Appendix B: Survey Questions

University Sense of Belonging Scale^[1]

Please answer each question about your university using the following scale.

- 1. Strongly disagree
- 2. Disagree
- 3. Somewhat disagree
- 4. Neutral
- 5. Somewhat agree
- 6. Agree
- 7. Strongly agree

Q467_1 I am enthusiastic about attending my university.

Q467_2 I am not happy to be at my university (R)

Q467_3 I feel a sense of belonging to my university.

Q467_4 I feel alienated at my university. (R)

Q467_5 I see myself as part of the community at my university.

Q467_6 My university is one of the best schools in the nation.

Q467_7 I identify strongly with my university.

Q467_8 I am a typical student at my university.

sQ467 University belonging (mean Q467_1 to Q467_8)

Note: (R) refelct reverse coded items

¹ Uniersity Sense of Belonging from Shook and Clay (2012), (Adapted)

Geoscience Interest Scale

On a scale of 1-7 where 1 equals Strongly Disagree and 5 equals Strongly Agree, how strongly do you agree or disagree with the following statements:

- 1. Strongly Disagree
- 2. Disagree
- 3. Somewhat Disagree
- 4. Neutral
- 5. Somewhat Agree
- 6. Agree
- 7. Strongly Agree

444a. How interested are you in taking courses in Earth Systems or Environmental Sciences?¹

445b. How interested are you in pursuing an Earth Systems or Environmental Sciences career?²

sQ_geoscience_interest = Full form of Geoscience Interests Scale (mean [Q444a – Q445b])

¹ Initial Interest (Hulleman et al., 2010), (Adapted)

² Interest (Hulleman et al., 2010), (Adapted)

Mentor Network Diversity and Gender-Matched Faculty Mentor Scale

A mentor is someone who provides guidance, assistance, and encouragement on professional and academic issues. A mentor is more than an academic advisor and is someone you turn to for guidance and assistance beyond selecting classes or meeting academic requirements. The questions in this survey will ask about both formal and informal mentors. Answer each question in regards to your CURRENT mentor unless it specifically asks about a previous mentor.

Q200 Is there a faculty member that you would consider a mentor?

- 0- No
- 1- Yes

Q204 What is the gender identity of your faculty mentor?

- a. Woman / Female (1)
- b. Man / Male
- c. Transgender Woman (1)
- d. Transgender Man
- e. Other

Q209 Students are sometimes mentored by many different people: teachers, program staff, graduate students, peers, coach, community member, etc. Please think about all of the other mentoring you receive including people who were not formally designated as mentors.

Are you currently mentored by any of the following groups of people?

- a. Graduate students
- b. Peers
- c. Other college/university faculty members
- 0- No
- 1- Yes

tQ209 = Sum (Q209a - Q209c)