

STIB: THE SYSTEMIC THINKING INVENTORY FOR BUSINESS

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ABSTRACT

This paper presents a scale to measure systemic thinking among business students called the Systemic Thinking Inventory for Business (STIB). Based on literature related to cognitive styles, three dimensions of systemic thinking were identified -Locus of Attention, Inter-Relatedness and Flexibility. A 16-item instrument was developed to capture the three dimensions. The scale's validity and reliability were assessed through an exploratory factor analysis and the three dimensional structure was supported. Pre- and Post-simulation analysis of scores on STIB showed that students significantly improve their locus of attention as they progress through the simulation. Individual-based simulations were also found to exhibit a diminished level of flexible thinking. An attempt to link STIB scores to simulation performance indicates that the Inter-Relatedness dimension of systemic thinking was positively related to average time spent making a decision as well as average stock price. Implications and future research are also discussed.

INTRODUCTION

Management education is tasked with developing decision makers that can manage in a global and, often, turbulent environment. Given that managers coordinate people, ideas, and beliefs in implementing strategies how these managers think will play a role in their decision making process and, ultimately, the organization's results. Systemic thinking, an approach to understanding reality, recognizes that systems have characteristics and patterns independent of their parts. As suggested by Allio (2003), "(Managers) have to understand how the interactions of the parts, and the parts with the whole and its environment, create the properties of the whole" (p. 3).

An exploratory study by Washington, Kurthakoti, Halpin, & Byrd (2014) measured the change in the level of systemic thinking of undergraduate students using a total enterprise business simulation. Using a rubric developed for the study, the researchers completed a content analysis of statements made by decision makers in an early and then later stage of the simulation. Results showed an increase in the systemic thinking skills of students as they progressed in the exercise. In addition, higher levels of systemic thinking in early periods of the simulation were positively related to subsequent performance ($p < 0.10$). Although insightful as to the importance and impact of systemic thinking on performance, this study had some limitations. First, the rubric developed for the study was specific to the simulation used which limited the generalizability of the findings. It was impractical to suggest that a different rubric be developed for each simulation used in business schools to assess a student's

systemic thinking skills. Second, while a rubric may be useful for assessing systemic thinking in a simulation environment it is not necessarily an appropriate methodology for assessing this skill across different pedagogical approaches such as lectures, experiential exercises, and cases. The current study aims to address these issues by offering a comprehensive scale to assess systemic thinking in students running two different simulations. Once tested for validity and reliability, we believe the scale can be used across disciplines and pedagogical approaches.

LITERATURE REVIEW

"Systems thinking is a way of understanding reality that emphasizes the relationship among various components in a process, rather than the independent constituents of the process" (Gregory & Miller, 2011, p. 259). Recognizing that a system has characteristics and patterns independent of its parts provides a rationale for business leaders to acquire skills that draw on their ability to view an entity in a holistic way (Allio, 2003; Henning & Chen, 2012). Systemic thinking integrates analysis and synthesis and is said to lead to greater understanding and better decision making. According to Laszlo (2012), "Analysis answers the questions 'what' and 'how'...Synthesis answers the 'why' and 'what for' questions" (p. 97).

Research on individual cognitive styles provides a starting point for us to identify key dimensions of systemic thinking. How one organizes and processes information is known as one's cognitive style. When applied to how one completes a task or responds in a decision making situation, some individuals may focus on the individual parts of the task while others take the set of information and process it in a global context. These different methods of thinking are thought to be relevant in problem solving situations and may help predict the success rates of decision makers (Sadler-Smith & Badger, 1998). Sternberg & Wagner (1998) offered thirteen thinking styles and created a scale, the Mental Self-Government Thinking Styles Inventory (MSG), which attempted to categorize individuals based on how they approach problem solving situations. They identified a number of tendencies in decision makers such as rule making, goal setting, and flexibility. Choi, Koo, & Choi (2007) contributed further to our understanding of thinking styles with their Analysis-Holism Scale, which distinguished between individuals who view the world in a holistic way and those with a focus on the world as a set of independent components. One of the four domains examined in this work, locus of attention, is a dimension of the construct proposed in the current study.

Business schools and programs seek to graduate students with the knowledge and skills to manage in a global economy. Facing increasingly complex environmental factors, solutions to

problems today are neither apparent nor satisfactory (Caldwell, 2012). Given the current business climate, decision makers must arrive at solutions in shorter periods of time and with less than complete information (Noel & Erskine, 2013). Leaders who are systemic thinkers may be able to adjust to time constraints and make sense of situations where the relationships or patterns may not have occurred previously. This requires higher-order thinking such as analysis, synthesis, and evaluation as defined by Bloom, Englehart, Furst, Hill, & Krathwohl (1959) or, more recently, the ability to analyze, evaluate, and create (Krathwohl, 2002). From the perspective of management education, identifying teaching methods that strengthen the systemic thinking skills of students is a reasonable goal. A range of tools including computer-based simulations, experiential exercises, and case analysis are recognized as effective methods of teaching business concepts. The focus of the proposed study uses a simulation to test several hypotheses.

Business simulations allow students to work alone or in groups to test their decision making skills. Moschella & Motiwalla (1997) argue that strategic thinking skills are improved using a simulation by requiring participants to engage in goal setting, strategy formulation, and planning. Lovelace, Eggers, and Dyck (2015) found critical thinking skills improved in those completing different web-based simulations across different classes - business strategy, human resources, and organizational behavior. Understanding the range of business course requirements that exist, we would argue that the more complex the concepts being studied the more complex the simulation should be resulting in a more challenging exercise. A total enterprise simulation fits this category since students are expected to consider how marketing, operations, finance, and management factors influence one another and affects the overall performance of an organization. Strategies used by participants in a simulation that are consistent with the environment they face are thought to indicate that learning is taking place (Wellington, Faria, & Whiteley, 1998). Given the above discussion, we propose:

Hypothesis 1. Participants improve their systemic thinking skills as they progress through a total enterprise business simulation.

The current research proposes the use of a newly developed survey instrument, the Systemic Thinking Inventory for Business (STIB), to assess systemic thinking. Items on the scale capture three dimensions the authors propose are major components of this construct. Included are:

Locus of Attention: Problem solving skills require an understanding of a situation and the ability to sort through vast amounts of data to select the most relevant and meaningful information (Moschella & Motiwalla, 1997). Locus of Attention pertains to what a decision maker focuses on while making decisions. Some individuals pay more attention to the parts of a task when developing a response while others take the information and process it all within a holistic context (Sadler-Smith & Badger, 1998). Systemic thinking requires a more holistic approach - an ability to view the whole task with qualities and characteristics distinct from its parts. In two studies using a business simulation as a tool there were differences in holistic cognitive perceptions across industries (Wellington, Faria, & Whiteley, 1998) and a persistent positive relationship between systemic thinking and performance over several periods (Washington, et.al., 2014). This dimension is captured in the STIB inventory through various statements that assess what a student pays attention to while performing tasks. (E.g. When

working on a task, I like when I need to pay attention to details; I like tasks where I can focus on general ideas, rather than specifics.) We predict:

Hypothesis 2a. Participants improve their level of Locus of Attention running as they progress through a total enterprise business simulation.

Inter-Relatedness: Successful decision making by managers requires an appreciation of the interconnectedness of the parts of a task or issue. This is a challenge for business leaders who are charged with identifying which elements of a situation are the most pressing and in need of attention (Moschella & Motiwalla, 1997). Organizations facing complex decision making situations can employ techniques such as chunking and specialization (Cannon, 1995) or mapping to visually represent the variables in a situation (Wallis & Wright, 2015). Modeling helps individuals conceptualize the system they are trying to understand. Identified as conceptual knowledge this is what enables a learner to understand how a system functions, how the parts interact with one another, and how the properties of the parts differ from the properties of the whole (Krathwohl, 2002; Richardson, 2008). This dimension of systemic thinking is captured in the STIB instrument through various statements that assess how students perceive the relationship between the whole and the parts. (E.g. When working on a task, I like to see how what I do fits into the overall picture; Everything associated with a task is somehow related to each other.) Based on the above, we predict:

Hypothesis 2b: Participants improve their level of Inter-Relatedness as they progress through a total enterprise business simulation.

Flexibility: In addition to thinking in a holistic way, seeing the relationship between the components of a task, a systemic thinker should also be creative and responsive to changing conditions while solving problems. This means having the ability and the will to be flexible in one's approach to problem solving. As organizations strive to remain relevant, successful leaders often frame situations they face in a way that allows for flexibility (Zaccaro, Gilbert, Thor, & Mumford, 1991). It is not uncommon for experienced decision makers to develop a range of responses to a particular problem. These experiences or 'scripts' are acquired over time and stored to memory - to be recalled at a later date. This increases the flexibility of a manager's decision making style and can lead to a greater ability to be creative in solving problems (Gioia & Poole, 1984). It is not the routine decision making situation that requires flexibility so much as the atypical one which calls on a leader to search through his/her array of past experiences to arrive at a range of possible solutions. Thus, we believe that a scale measuring systemic thinking should include a dimension we call 'flexibility'. This component is captured in the STIB inventory through statements that assess the extent of students' rigidity in completing tasks. (E.g. When considering ways to complete a task, I tend to approach it in a traditional way; When working on a task, I like to do things in new ways not used by others in the past). We predict:

Hypothesis 2c: Participants improve their level of Flexibility as they progress through a total enterprise business simulation.

Understanding the thinking process of decision makers may

help explain the quality of the solutions they offer and, ultimately, whether there is a relationship between thinking style and performance (Gioia & Poole, 1984). As schools of business are charged with developing managers with a broad perspective and an ability to make decisions in a complex world the use of experiential learning methods, multidisciplinary courses, and group exercises may aid in the development of successful leaders (Moschella & Motiwalla, 1997). Knowing that quantitative results in a business setting are used to assess the decision making skills of business leaders a final hypothesis is proposed which relates the level of systemic thinking to performance on a total enterprise simulation.

Hypothesis 3: Systemic Thinking is positively related to simulation performance.

METHODOLOGY

In this study we assess the systemic thinking skills of undergraduates enrolled in two business courses that traditionally run a total enterprise simulation. One course is an introductory business class taken in the first or second year by business and non-business majors. The second is a senior capstone class (business policy) taken only by business majors in the final year. All students are enrolled in a small comprehensive university located in northeastern US.

This research had three main objectives – (a) assessing the structural validity of a systemic thinking inventory for business; (b) assessing whether students in a business class improve their scores on the inventory after participating in a simulation, and (c) testing the relationship between the score on the systemic thinking inventory and performance on the simulation.

In the first phase of the study, we identified 25 statements we believe capture three essential dimensions of systemic thinking, based on work done in prior studies as well as face validity.

Each statement was rated by students using a 5-point Likert Scale (Strongly Disagree to Strongly Agree). Administration of the inventory was done during the Fall 2014 and Spring 2015 semesters. The instrument was administered twice for each participant – *before* they started the simulation and *after* its completion.

The simulation used in the introductory business course was BizCafe: The Business Essentials Simulation (James & Deighan, 2015). In the business policy class students worked with Micromatic: A Strategic Management Simulation (Scott, Kaliski, & Anderson, 2013). BizCafe was administered as an individual simulation where students independently managed a business while Micromatic was a team-based exercise with groups of 3-4 students managing a firm. The rationale for collecting data from both types of users (individuals and groups) was to look closely at the three components of the construct in decision makers facing situations with changing conditions. Individual vs. group decision making were thought to have the potential to influence results.

Given the small size of the business program at the institution, the survey was administered in multiple sections over two semesters, Fall 2014 and Spring 2015. In the Fall term, the survey was administered to 108 students in the introductory business course. In the Spring, it was administered to 40 students in the introductory business course and 45 students in the business policy class. Participation was voluntary and students received no compensation (financial or extra credit) for their participation. The survey for the introductory business classes was administered face-to-face, while the survey for the business policy sections was administered via SurveyMonkey through individualized invites to each student. Each student participating in the study was provided with a unique code that had to be entered while taking the survey. This approach helped us to match the pre-and post-surveys for participants and, for the policy students, match the survey results with simulation performance

EXHIBIT 1 TEST OF SCALE RELIABILITY

Factor	# of items	Cronbach Alpha
Locus of Attention (pre simulation)	7	0.791
Locus of Attention (post simulation)	7	0.819
Inter-Relatedness (pre simulation)	6	0.661
Inter-Relatedness (post simulation)	6	0.720
Flexibility (pre simulation)	3	0.666
Flexibility (post simulation)	3	0.577

EXHIBIT 2 PAIRED T-TEST RESULTS: PRE- AND POST-SIMULATION SCORES ON STIB (N = 126)

Test Pair (Post - Pre)	Pre-Simulation Average	Post-Simulation Average	Difference in Mean	t statistic	p value
Locus of Attention	2.952	3.124	0.172	3.290	< 0.01
Inter-Relatedness	4.034	4.068	0.034	0.846	> 0.10
Flexibility	2.298	2.182	-0.116	-2.258	< 0.05
Overall (Pooled) – H1	3.095	3.124	0.029	1.076	> 0.10
Overall (Intro Class; n = 104)	3.109	3.132	0.023	.754	> 0.10
Overall (Policy Class; n = 22)	3.028	3.085	0.057	1.073	> 0.10

using email information. Of the 193 total participants, matching data (pre- and post- surveys) could be obtained for 126 participants (104 for the introductory business class and 22 for business policy) so this became our sample frame for analysis.

DATA ANALYSIS AND RESULTS

Determination of Factor Structure

Reliability analysis using Cronbach’s alpha was initially performed on the different sets of data independently (Fall 2014; Spring 2015; introductory business class; and business policy class). Reliability tests indicated that all sets of data displayed similar reliability levels for the three theorized factors of the STIB (Locus of Attention, Inter-Relatedness, and Flexibility). As a result, the data from both semesters and across both classes was pooled to boost sample size for testing the scale structure and validity.

Given the size of our sample and the number of items on the scale, exploratory factor analysis (EFA) was deemed appropriate for testing the factor structure. Although a confirmatory factor analysis is more robust for testing factor structures, given our limited sample size, we could not perform a confirmatory analysis and expect reliable results. Hair et al. (2009) suggest a sample size of at least 5 observations for each variable to be analyzed. Driven by this suggestion, an EFA was performed on the pooled data. Factors were allowed for free estimation based on eigen values as well as were restricted to three factors as theorized. Oblimin rotation was used initially to rule out the possibility of inter-factor correlation. Results indicated that inter-factor correlation was not significant and so a revised analysis using Varimax rotation was performed. All references to factor structure and its use in analysis are based on the results of EFA with Varimax rotation. Allowing for free factor estimation resulted in the extraction of a total of 6 factors that explained 58-60% of variability (for the pre- and post- sets). Forcing the factor structure to only 3 factors resulted in a 42-44% variance extraction. However, when we looked at the composition of the factor structures, we observed that the three additional factor structures created primarily consisted of those scale items that

were heavily cross loaded in the 3 factor solution. Going back to the survey instrument, it was found that these cross loaded items contained words that might be subject to a different interpretation. So the cross loaded items were removed and the EFA was performed again. This resulted in generating a 3 factor solution with most of the items for each factor loading on to its hypothesized factor. The total variance extracted in this solution was between 48-50%. The final solution resulted in three factors – Locus of Attention (7 items), Inter-Relatedness (6 items) and Flexibility (3 items). The factor loadings for individual items on the final scale for both pre- and post-simulation conditions are provided in the Appendix.

Reliability analysis of the three factors indicates they all had very high reliability, especially for an exploratory study. Factor analysis and reliability tests were conducted separately on both pre-simulation and post-simulation surveys and it was consistent. Results of the Reliability analysis are provided in Exhibit 1.

Testing Hypotheses 1 & 2

A paired sample t-test was conducted to test our first two hypotheses. Since the study was designed as a within-subjects study, a paired sample t-test was deemed appropriate (Stevens, 2002). Scores for items corresponding to each factor of the STIB were averaged to create a summated scaled for each factor. Paired t-tests were conducted with the results shown in Exhibit 2. Hypothesis 1 stated that students would improve in their systemic thinking when working on a simulation. That is, the overall post-simulation STIB score would be higher than the overall pre-simulation score. Examining differences for the total sample as well as two sub-groups (students in an introductory business class and students in a business policy class) the results shown in Exhibit 2 do not support this hypothesis (rows 4 through 6). Levels are moving in the direction hypothesized, positive, but the differences are not significant. H1 is, therefore, not supported.

The factors Locus of Attention and Flexibility show significant differences between the pre- and post-simulation levels. Locus of Attention is in the direction hypothesized so we conclude that H2a was supported. The dimension Flexibility pro-

EXHIBIT 3 PAIRED T-TEST RESULTS FOR FLEXIBILITY: PRE- AND POST-SIMULATION SCORES ON STIB

Course	Pre Simulation Average	Post Simulation Average	Difference in Mean (post-pre)	t statistic	p value
Introductory Course (n=104)	2.298	2.141	-0.157	-2.677	< 0.01
Business Policy (n=22)	2.303	2.378	0.075	0.816	> 0.10

EXHIBIT 4 PAIRED T-TEST RESULTS FOR OVERALL STIB SCORE EXCLUDING FLEXIBILITY

Test Pair (Post - Pre)	Pre Simulation Average	Post Simulation Average	Difference in Mean	t statistic	p value
Overall (Pooled; n = 126)	3.493	3.596	0.103	2.915	<0.01
Overall (Intro Class; n = 104)	3.515	3.628	0.113	2.802	<0.01
Overall (Policy Class; n = 22)	3.390	3.438	0.047	0.803	>0.10

vides a most surprising result. There is a significant difference between the pre- and post-periods but in a direction contradictory to our hypothesis. In other words, flexibility scores were significantly lower at the end of the simulation than at the beginning. A difference occurred but not in the direction hypothesized so H2c is not supported. The Inter-Relatedness score remained stable over the period so the results are not significant and H2b is not supported. This may have been due to a high level at the pre-simulation stage (4.034 on a 5-point scale). Perhaps there is not much room for improvement when respondents start out at such a high level on a factor.

The unexpected results on the Flexibility dimension led us to examine this construct in greater depth by considering other conditions facing students running a simulation. As stated earlier, Flexibility in one’s thinking is expected to foster creativity in problem solving plus improve overall decision making when facing stressful and uncertain conditions. Reflecting on the environment facing the participants in this study, those in the introductory business class operated their firm alone, not in groups. On the other hand, business policy students worked in groups. In addition, the simulation was only a small part of the overall grade for the introductory class but a major component in the business policy class. Given the group dynamics effect and importance of simulation performance to those in the policy class it is possible that the data on Flexibility might need to be parsed further to get a clearer picture of what is happening. Students in the introductory business class worked alone so there was no opportunity for them to discuss their strategy/plans with others, compromise on any issue, or face a challenge about their point of view. This may have resulted in these individuals becoming less flexible and less creative in their decision making. To test for this possibility, we split the flexibility data by class (introductory course and policy class) and performed some t-tests. Details are provided in Exhibit 3 below.

As we can see from Exhibit 3, the score on Flexibility decreased as the simulation progressed for those in the introductory course and increased in the business policy course. Working alone with sole responsibility for decision making (introductory course) might reduce a person’s ability to see alternatives in a decision making situation. For those working in groups (Policy class) there was improvement on this dimension but given the small sample size of this population, the effect was not profound. We conclude that the aggregated data shown earlier in Exhibit 2 are likely skewed by the larger number of individuals in the introductory class. This negative directionality of the Flexibility score is likely to have interacted with the positive impact of Locus of Attention, thereby rendering the overall score on the STIB non-significant. As we can see from Exhibit 3, Flexibility had a significant adverse impact on students work-

ing alone on a total enterprise simulation. Recognizing the possible impact of this negative relationship, the overall STIB score was re-estimated excluding the Flexibility score. T-tests were conducted on the re-estimated Pre- and Post-Simulation scores with the results shown below in Exhibit 4.

As shown in Exhibit 4 the revised Overall score on the STIB (Locus of Attention and Inter-Relatedness) does show a significant increase in the post-simulation scores for students in the introductory class. Thus, we conclude that H1 is partially supported.

Testing Hypothesis 3

Any study of pedagogical effectiveness is useful only if it can demonstrate the benefits of the technique in improving student performance. Although Exhibits 2 and 3 indicate that changes occur in the systemic thinking of those involved with a simulation, it would further substantiate the value of the STIB if we demonstrate a relationship between a student’s STIB score and performance on the simulation. Data collected from the introductory business class was anonymized and so it was not possible to match student responses on the STIB to their simulation performance. On the other hand students in the business policy course responded to the STIB as individuals, but participated in a simulation as a group. Therefore, relating individual responses to group performance would not be an appropriate analysis. However, students in the policy course were required to run a version of the simulation on their own as part of their final exam. Therefore, simulation results on this individual assignment could be used to test whether STIB scores are related to performance.

Various metrics were available from the simulation to be proxies for student performance. These included Return on Sales, Profits, Inventory Turnover, Stock Price, etc. Of those reviewed, stock price was thought to best represent a firm’s overall performance as it was determined by the market and was, therefore, selected. We also had access to the time students spent processing decisions during the exercise so that data were included. We expected that stronger systemic thinking skills were related to time spent making decisions. That is, the higher the systemic thinking level the longer the time spent making decisions. This added the variable ‘Average Time per Decision’ to the correlation analysis.

To examine the relationship between the three dimensions of systemic thinking and the two dependent variables (stock price and the time spent), a correlation analysis was performed. These results are provided in Exhibit 5.

Results from Exhibit 5 indicate that Inter-Relatedness correlates positively with both Average Time per Decision and Performance (Average Stock Price). For business policy stu-

EXHIBIT 5
CORRELATION BETWEEN THE THREE DIMENSIONS OF SYSTEMIC THINKING
AND SIMULATION PERFORMANCE (TIME PER DECISION,
AND STOCK PRICE) FOR THE BUSINESS POLICY CLASS
(N = 22)

Variable	Average Time per Decision (Minutes)	Average Stock Price (\$)
Locus of Attention	-0.315	-0.333
Inter-Relatedness	0.376*	0.379*
Flexibility	0.109	0.268

* $p < 0.10$

dents understanding connections between the components of a total enterprise simulation results in more time spent making decisions. Understanding these connections is also significant and positively related to Performance (Stock Price). Greater skills on the dimension of Inter-Relatedness result in longer periods between decisions but with better results, something rewarded in business. Interestingly, Locus of Attention and Inter-Relatedness exhibit a strong negative correlation for these students running a total enterprise simulation. Those paying more attention to details (Locus of Attention) have a greater interest in the parts of a task than the exercise as a whole. This may work in opposition to thinking that is focused on tying all of the parts of a task together.

Additional Analysis

In an attempt to further strengthen the correlation results, two sets of regressions were conducted on the student performance data. Average Stock Price at the end of the test was used as the dependent variable in the first model and the Average Time Spent Per Decision (in minutes) was used as the dependent variable in the second. The Post-Simulation Scores on each the three dimensions of the STIB (Locus of Attention, Inter-Relatedness, and Flexibility) were the independent variables in both models. However, given the small sample size and strong correlation between two of the independent variables (Locus of Attention and Inter-Relatedness) we did not expect the regression models to yield any significant insights. This was the case as neither of the models turned out to be significant. Additionally, the model exhibited high collinearity due to the high correlation between the Locus of Attention and Inter-Relatedness dimensions.

DISCUSSION

Based on the analysis several things about systemic thinking come to light. First, consistent with Gregory & Miller's (2011) definition of Systemic Thinking, our analysis provides support for the multidimensional nature of the systemic thinking construct. EFA and scale reliability tests indicate systemic thinking to be a three factor construct – Locus of Attention, Inter-Relatedness and Flexibility.

Second, students demonstrated improved systemic thinking as they progressed through the simulation. This supports the argument of Moschella & Motiwalla (1997) that a simulation encourages systemic thinking by requiring strategy thinking and planning. Changes in levels of the individual components of the construct include some interesting findings. As hypothesized, Locus of Attention (focusing on the whole task as opposed to the parts) shows significant improvement after running a simulation. These results are consistent with Sadler-Smith & Badger (1998) proposition that systemic thinkers are more likely to process info in a holistic context. All simulation participants improve on this dimension whether working alone (introductory business class) or in groups (business policy class).

Third, with regard to Flexibility, there is a significant difference between the pre- and post-periods but not in the direction hypothesized. The significant negative relationship reveals that participants appear to be more rigid or less likely to consider alternate methods of completing tasks after participating in a simulation. Additional analyses to explore this difference show that there are differences between the two groups of students. Those in the introductory class work alone on the simulation which means there is no collaboration or discussion with others to arrive at a strategy for their firms. Acting alone is likely to

limit one's perspective and interest in developing alternative solutions in a given situation. Additionally, these students have had limited experience making business decisions. As argued by Gioia & Poole (1984) this results in a shallower repertoire of options to consider during task completion. Students in the business policy class work in groups. Their Flexibility scores increased over time, in the direction hypothesized, but the change is not significant which we think is due to the small sample size. Working in groups appears to foster flexibility in one's thinking. The simulation for the policy class is more complex and presents more dynamic situations under which decision making occurs. As Gioia & Poole (1984) state, the more complex and atypical a situation the greater the need for flexibility. Those in the policy class have more familiarity with business practices and, therefore, a richer repertoire of experiences to tap into when faced with complex decision making situations. This is, perhaps, why we see a reduction in flexibility among those in the introductory class and an increase in the policy class.

Fourth, a revised analysis of the Overall Score without Flexibility shows a significant increase in the Post-Simulation scores for both the entire sample and those in the introductory business class. This suggests that flexibility may have a stronger role in the systemic thinking construct by moderating the development of systemic thinking for those running a business simulation. Since such a phenomenon was not expected and given the limited sample size of the study, this proposition was not explored further. Future studies may want to focus on the role of flexibility in systemic thinking.

Fifth, this analysis suggests that systemic thinking may have an impact on performance. Greater inter-relatedness between parts of a task was positively associated with both time required to make decisions and stock price in the simulation for those in the policy class. This indicates that as students start seeing the relationship between the various parts of a task, they take more time to analyze available information and this delays decision making. This is consistent with Hill & Cox (1994) who found a positive relationship between complexity and duration of the simulation.

Finally, the development of one instrument that can measure systemic thinking in business students regardless of teaching method used (simulations, cases, experiential exercises) will lead to more research in this area and a better understanding of the benefits of each. This methodology also addresses the challenge faced in earlier studies where the use of a simulation-based rubric reduced the generalizability of the findings (Washington, Kurthakoti, Halpin, & Byrd, 2014; Lovelace, Eggers, & Dyck, 2015).

LIMITATIONS AND FUTURE DIRECTIONS

Given limited samples we were only able to perform an Exploratory Factor Analysis. Although this is a good approach to identify important items that make up a construct, a more rigorous confirmatory factor analysis is preferred to identify and determine the factor structure as well as its validity and reliability (Hair, 2009). Our limited data precluded us from performing these rigorous analyses. Gathering responses from larger samples would help create a more robust and valid scale to measure systemic thinking.

As stated in our discussion, the exact nature of Flexibility and its impact on systemic thinking could not be explored due to the limited sample size. Large sample analysis is likely to make the data more amenable for additional analysis that could be used to generate deeper insights into the nature of this dimension and its impact on the other dimensions of systemic

thinking. Another limitation is linked to the data collection procedures as we were unable to relate individual performance of those in the introductory class with their score on the STIB. Anonymized data collection fosters candid and frank responses yet makes it hard to do further analysis due to lack of identifiable information. The limited data we had for the policy class (n=22) suggests a positive relation between systemic thinking and simulation performance, but the sample size was clearly not sufficient to demonstrate a strong relationship.

Our overarching goal through this research is to develop a scale that not only measures systemic thinking but also can aid in developing appropriate pedagogical techniques that foster the systemic thinking of business students. To that effect, testing the scale across various pedagogical approaches used in business schools (lecture only, lecture + discussion, case analysis, simulations, etc.) would be a good extension of this study and provide validity to the STIB. This will also help us compare and assess various pedagogical approaches regarding their impact on systemic thinking.

CONCLUSION

In this study we proposed that when students participate in a total enterprise simulation they develop systemic thinking skills. We developed an instrument called the Systemic Thinking Inventory for Business (STIB) and, using factor analysis, identified three components of the construct: Locus of Attention; Inter-Relatedness; and Flexibility. We argued that the overall score as well as the levels of each component would increase with the use of a total enterprise simulation and that systemic thinking and simulation performance are related. What we found was that the thinking of participants using a total enterprise simulation changes over time in ways that have implications for schools of business. These findings provide evidence that systemic thinking can be assessed and developed with the use of a business simulation and that one of the underlying components of the construct, Flexibility, has some interesting properties.

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APPENDIX A
FACTOR LOADINGS FOR STIB IN PRE- AND POST-SIMULATION CONDITIONS

Factor Loading Structure – Pre Simulation				Factor Loading Structure – Post Simulation			
Item #	Component			Item #	Component		
	1 (LA)	2 (IR)	3 (Flex)		1 (LA)	2 (IR)	3 (Flex)
Item 3	.644			Item 3	.796		
Item 5	.568			Item 5	.618		
Item 8	.692			Item 8	.789		
Item 10	.687			Item 10	.709		
Item 12	.663			Item 12	.658		
Item 15	.751			Item 15	.695		
Item 21	.627			Item 21	.537		
Item 4		.629		Item 4		.637	
Item 9		.554		Item 9		.636	
Item 13		.514		Item 13		.501	
Item 23		.652		Item 23		.820	
Item 24		.624		Item 24		.594	
Item 25		.641		Item 25		.685	
Item 6			.841	Item 6			.795
Item 16			.649	Item 16			.663
Item 18			.813	Item 18			.683

Contact the authors for additional information about the scale description.