EXPLORING THE BEHAVIOURAL PATTERNS IN PROJECT-BASED LEARNING WITH ONLINE DISCUSSION: QUANTITATIVE CONTENT ANALYSIS AND PROGRESSIVE SEQUENTIAL ANALYSIS

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ABSTRACT
Project-based learning using online learning environments is becoming increasingly popular. To in-depth explore the behavioural patterns and limitations faced by students in project-based learning where online forums are used. This study conducted an empirical case study of an online project-based learning activity in a management course, in which 70 college students participated. The study integrates two analytical approaches: quantitative content analysis and progressive sequential analysis. The analytical approaches allow researchers to explore and visualize the content and patterns of participants’ online project learning discussion behaviours. The results indicate that learners’ limitations include poor time-management and insufficient initial data collection. The students also demonstrated a lack of proper data evaluation processes and sufficient comprehensive analysis. The limitations are in-depth discussed and suggestions for teachers and educational software developers are also proposed.

Keywords: online discussion, project-based learning, behavioural pattern, progressive sequential analysis

INTRODUCTION
Project-based learning is a learner-centred instructional approach and can help students develop skills such as data collection, coordination, peer discussion, and information analysis (Blumenfeld et al., 1991; Thomas et al., 1999; Thomas, 2000), and this teaching approach is becoming increasingly applied. Project-based learning has been combined with different instructional strategies in recent years and applied to various subject domains (e.g., Şahin, 2008; Neo & Neo, 2010; van Rooij, 2009; Hou et al., 2007a). Its characteristics have also been discussed in numerous studies (e.g., Koo et al., 2009; Ipek, 2010; Park & Ertmer, 2008; Kramer et al., 2007; Hou et al., 2007a; Lam et al., 2009; Thomas, 2000; Edelson et al., 1999; Krajcik, et al, 1998). The employment of web environments in project-based learning has also become an important aspect of educational technology. Past studies have revealed students often lack in-depth analysis process (Hou et al., 2007a; Hou et al., 2007b; Thomas, 2000; Krajcik, et al., 1998; Edelson, Gordon, & Pea, 1999) and treat online information as direct answers to questions on project topics (Wallace & Kupperman, 1997; Chang & McDaniel, 1995) in project-based learning, and this may result in inappropriate inferences and discussions (Krajcik, et al., 1998). Limitations in peer collaboration and time management have also been noted (Thomas, 2000; Hou et al., 2007b).

On the other hand, since asynchronous discussion allows learners to interact with each other on a topic and construct knowledge, argumentation may also be achieved (e.g., Oh & Jonassen, 2007; Cho & Jonassen, 2006). Due to the increasing popularity of online forums, project-based learning that is based on online discussion activity (e.g., Hou et al., 2007a) has become a topic that deserves to be analyzed at a deeper level.

Therefore, the analysis of actual behaviours in project-based learning that incorporates online discussion is the key objective in this study. Analyzing the behavioural patterns may further explore the potential causes and natures of the aforementioned limitations. These findings may also serve as important references for teachers with regard to strategies used for intervention and guidance in project-based learning that incorporates online forums.

There have been studies in the area of online discussion-based teaching (e.g., Hewitt, 2005; Patricia & Dabbagh, 2005; Hou et al., 2007a, 2008). However, studies on project-learning discussion behaviours (e.g., the clarification of topics, coordination of projects, and collection/evaluation of data) are rare recently. Therefore, it is a crucial research topic to empirically analyze the behavioural patterns of a project-based learning activity incorporating an online discussion activity. In this study, an new analytical approach which integrates two analytical methods: quantitative content analysis (Rourke & Anderson, 2004) and sequential analysis (Bakeman...
& Quera, 1995) is proposed and applied to explore the behavioural patterns of a online project-based learning activity. A coding scheme for learning behaviours has been devised based on past studies of project-based learning (Blumenfeld et al., 1991; Thomas, Mergendoller & Michaelson, 1999; Thomas, 2000). Each discussion-message will be chronologically ordered and will undergo a quantitative content analysis and a series of progressive sequential analysis in an integrative manner. The proposed new analytical methods will allow researchers to use progressive, chronologically-ordered sequential analysis to infer visualized patterns in the progress of students’ project-learning related behaviours. By the above pattern analysis, researchers can in-depth explore and discuss limitations of learners’ behavioural patterns. The specific purposes of this research are as follows:

1. Conduct a project-based learning activity incorporating an online discussion activity. Integrate quantitative content analysis and progressive sequential analysis to analyze the behavioural patterns of learners’ project-learning behaviours.
2. Discuss limitation of the patterns and provide suggestions for teachers with regard to strategies used for guidance in online project-based learning.

METHOD

Participants and Procedures
The participants in this case study were 70 college students studying management, all of whom had completed information-related courses and were capable of using online forums. This study arranged a project-based learning activity incorporating online discussion in a management course that was undertaken by these students. The students were asked to analyze a business-management case assigned by the teacher, and to complete a project report collaboratively. Their assignment was to analyze the obstacles faced by an organization’s managers and to provide suggestions. The entire project-based discussion activity was conducted in the forum that this study provided, and which only had basic functions, such as posting and replying to articles and showing the list of articles, in order to avoid interference from outsiders or the complications of a complex interface. The 14-day activity required the 70 students to collaborate, jointly collect data and make comments on its analysis, compile their findings, and present the final report in the forum by posting articles and responses. During the entire process of discussion, the teacher was not allowed to intervene or provide guidance in order to avoid the teacher’s subjective guidance.

Design
In this study, quantitative content analysis and progressive sequential analyses were adopted. According to the coding scheme for project-based learning discussion behaviours (see the section of Coding scheme and Data Analysis), each article and response posted by a student was coded based on chronological order so that researchers might explore the patterns of students’ daily project-based learning. Lag sequential analysis (Bakeman & Quera, 1995) allowed researchers to examine whether the sequence of a certain coded behaviour followed by another occurs with statistical significance (e.g., whether the students demonstrated the behavioural pattern of conducting an “initial data-evaluation” after completing “data-collection” in a project-based learning activity). This method, which has been adopted by studies of online learning and online communities (e.g., Hou et al., 2007a, 2008, 2009), allowed researchers to infer a visualized diagram of behavioural patterns. In this study, a progressive sequential analysis was proposed and adopted, in which the data that was coded daily underwent a lag sequential analysis for behavioural patterns. For example, the codes accumulated in the first day, in the first two days, in the first three days, and so on, right up till the last day, were analysed for behavioural patterns as a way for exploring how the students’ behaviours shifted on a daily basis. This approach allows us to understand the time points at which significant sequences emerge, continue, or disappear. This study proposed this fairly new analytical approach with the desire to analyse characteristics and limitations in students’ project-based learning, and to increase its research validity. In contrast with past approaches of only conducting one-time sequential analyses of all the coded data (e.g., Hou et al., 2007a, 2008, Jeong, 2003), our approach could allow us to better understand students’ processes in daily project learning.

Coding scheme and Data Analysis
After reviewing past studies on project-based learning (e.g., Blumenfeld et al., 1991; Thomas, Mergendoller & Michaelson, 1999; Thomas, 2000, etc.), the study compiled procedures and models for project-based learning. This research also considered the characteristics of online discussion and proposed the coding scheme (seen in Table 1), which is dedicated to behaviours in online project-based learning discussions.
Table 1 Coding scheme for project-based learning online discussion behaviours

<table>
<thead>
<tr>
<th>Code</th>
<th>Dimension</th>
</tr>
</thead>
<tbody>
<tr>
<td>PL1</td>
<td>Initial analysis of the project topic</td>
</tr>
<tr>
<td>PL2</td>
<td>Presence of data collection relevant to the project.</td>
</tr>
<tr>
<td>PL3</td>
<td>Initial evaluation of the collected data.</td>
</tr>
<tr>
<td>PL4</td>
<td>Writing on and analysis of the project content.</td>
</tr>
<tr>
<td>PL5</td>
<td>Comprehensive analysis, compilation of existing analysis and data.</td>
</tr>
<tr>
<td>PL6</td>
<td>Proposing comments regarding task coordination.</td>
</tr>
<tr>
<td>PL7</td>
<td>Discussions irrelevant to the project.</td>
</tr>
</tbody>
</table>

For content analysis, each article or response posted in the forum was coded by a professional psychology researcher. Since each posted article could receive multiple responses, this study treated each article as a unit: the content of a posted article was treated as the first message, while the responses it received were treated as its continuing messages based on their chronological order. Using the coding scheme, the coder coded each message based on the dominant content of the message and on which item in the coding scheme best applied to the content of the message. The codes were chronologically ordered so that researchers could analyze daily frequencies. After the discussion from 14 days of activity was coded, 180 coded messages were yielded. To ensure the inter-coder reliability, the entire discussion was coded by another coder with a similar background. The Kappa value was 0.73 (p < .001), reaching the .001 level of significance. The collected data was then provided for further analysis.

RESULTS AND DISCUSSION

The distribution of the coded behaviours gathered from the 180 coded messages generated during the 14-day activity is shown in Figure 1. Instances of PL3 and PL6 were not found and are thus not included in the figure. Figure 1 indicates that PL4 (writing and analysis) is most frequent (67.78%), followed by PL1 (initial analysis: 18.33%). The frequencies of the other codes are much lower than that of PL4. The fact that PL7 (irrelevant discussions) only took up 2.22% of the total suggests that the students demonstrated a certain level of focus during the project-based learning activity.

![Figure 1 Distribution of the quantitative content analysis of codes in online project-based learning](image)

Past research has highlighted learners’ limitations of analysis process in online project-based learning (Hou et al., 2007a; Thomas, 2000; Krajcik, et al., 1998; Edelson, Gordon, & Pea, 1999). The coding of the behaviours in our study may allow in-depth understanding how these limitations are formed. For example, a fact worth noticing is that the frequency of PL2 is rather low (8.89%), and the participants may have proceeded directly to initial analysis and writing (PL4) without going through data-evaluation (PL3 was not found). In addition, they...
did not discuss task coordination (PL6 was not found). Compilation and comprehensive analyses were also limited (PL5 only took up 2.78%). PL3 and PL5, which indicate the ability to evaluate and summarize different comments and information, are important components of argumentation (Erduran et al., 2004) which the participants often lacked.

In order to further examine the issue of time management in project-based learning as mentioned in previous studies (e.g., Thomas, 2000; Hou et al., 2007b), the number of daily discussions in our study is summarized in Figure 2. As shown by Figure 2, the total number of postings from Day 1-8 (taking up 57.14% of the entire task-time) was as low as 27.8%. On Day 9, however, the number increased significantly (17.8%), but dropped again by Day 10. According to the review of the discussion content on Day 8-10, this temporary rise may have been a chain reaction by numerous participants who actively posted articles on Day 9, but the effect was not sustained.

![Figure 2 Distribution of the frequency of daily discussions](image)

After Day 11, however, the extent of discussion nearly doubled every day, indicating a sudden increase as the project came to an end. A possible reason for this is that students often procrastinate about their studies until the last minute. To better reveal potential causes and more details, this study conducted a quantitative content analysis based on the time-line. The daily frequency of each code is summarized in Figure 3. The results showed that discussion in the first 8 days was not only less frequent but also had fewer instances of PL1 (initial analysis) or PL2 (data-collection). The behaviours in the first 8 days were mostly direct analyses and writing on the project (PL4). By going directly to PL4, the students may have indicated a lack of initial understanding and data-collection, as a result of which the depth of the discussion later on may have been rather shallow, or may have involved inappropriate inferences (e.g., Krajcik, et al., 1998). This study also discovered that PL4 had three ups and downs from Day 1 to Day 8, yet its frequency tends to drop. This indicate that active participation in analyses during this stage tends to drop and the participants were not motivated enough. On Day 9, PL1 and PL2 increased along with PL4; from Day 12 to Day 14, PL1 increased, while data-collection (PL2) did not. Researchers also noted that PL5 (comprehensive analysis) was still rather infrequent during the entire process, even in the later stages. This reflects the consequences of the participants’ lack of initial data collection; as a result, they were not able to quickly gather, analyze or compile the needed information and comments from each other in the later stages.
To better understand the relationships between each code, a series of lag sequential analysis (Bakeman & Quera, 1995) were conducted, which allows us to examine the overall interactions between codes within a certain timeline and to visualize behavioural sequences. The Adjusted Residuals Table of sequential analysis could be created by calculating the transition-frequencies of the behaviours during a certain time period (Bakeman & Quera, 1995; Hou et al., 2007a, 2008; Jeong, 2003).

Table 2 is an example (Day 1-9). Each z-score in the table indicates whether a given sequential continuity was significant. The rows in the table represent the starting behaviours, and the columns represent behaviours that followed the starting behaviours. A z-score of +1.96 or higher indicates a significant sequence (p<0.05). Table 2 indicates that up until Day 9, the two sequences that reached the level of significance were PL1->PL1 and PL4->PL2.

Table 2 Adjusted Residuals Table of sequential analysis (lag=1, Day 1-9)

<table>
<thead>
<tr>
<th></th>
<th>PL1</th>
<th>PL2</th>
<th>PL4</th>
<th>PL5</th>
<th>PL7</th>
</tr>
</thead>
<tbody>
<tr>
<td>PL1</td>
<td>6.51*</td>
<td>-0.9</td>
<td>-1.51</td>
<td>-0.34</td>
<td>-0.59</td>
</tr>
<tr>
<td>PL2</td>
<td>-0.68</td>
<td>-0.9</td>
<td>0.24</td>
<td>-0.34</td>
<td>1.49</td>
</tr>
<tr>
<td>PL4</td>
<td>-7.08</td>
<td>3.05*</td>
<td>1.01</td>
<td>1.15</td>
<td>-0.72</td>
</tr>
<tr>
<td>PL5</td>
<td>0</td>
<td>0</td>
<td>0</td>
<td>0</td>
<td>0</td>
</tr>
<tr>
<td>PL7</td>
<td>-0.5</td>
<td>-0.67</td>
<td>0.61</td>
<td>-0.25</td>
<td>-0.44</td>
</tr>
</tbody>
</table>

Though past studies have addressed the sequences of behavioural patterns in online learning (e.g., Hou et al., 2007a, 2008; Jeong, 2003), all of them have been a one-time analyses in which all the codes were gathered and analysed together. This approach, however, does not allow us to explore the possible progressive transformations of behavioural pattern sequences in each time stage. To address this issue, this study conducted a progressive sequential analysis; that is, the codes accumulated from Day 1 through any other day were placed under sequential analysis based on their dates (as shown in Table 3).

The result indicates that the 14-day process can be divided into 3 stages. Based on the significant sequences, the behavioural transition diagrams were inferred (as shown in Figure 4); in these, each arrow indicates the direction of a shift in a significant sequence. Based on this, researchers can further explore how the discussion behaviours are correlated with each other.
Table 3 Progressive sequential analysis of discussion behaviours in online project-based learning

<table>
<thead>
<tr>
<th>Day</th>
<th>Significant Behavioural Sequences</th>
</tr>
</thead>
<tbody>
<tr>
<td>1</td>
<td>N/A</td>
</tr>
<tr>
<td>1-2</td>
<td>N/A</td>
</tr>
<tr>
<td>1-3</td>
<td>N/A</td>
</tr>
<tr>
<td>1-4</td>
<td>N/A</td>
</tr>
<tr>
<td>1-5</td>
<td>N/A</td>
</tr>
<tr>
<td>1-6</td>
<td>N/A</td>
</tr>
<tr>
<td>1-7</td>
<td>N/A</td>
</tr>
<tr>
<td>1-8</td>
<td>N/A</td>
</tr>
<tr>
<td>1-9</td>
<td>PL1-&gt;PL1, PL4-&gt;PL2</td>
</tr>
<tr>
<td>1-10</td>
<td>PL1-&gt;PL1, PL4-&gt;PL2</td>
</tr>
<tr>
<td>1-11</td>
<td>PL1-&gt;PL1, PL4-&gt;PL2</td>
</tr>
<tr>
<td>1-12</td>
<td>PL1-&gt;PL1, PL4-&gt;PL2, PL4-&gt;PL4</td>
</tr>
<tr>
<td>1-13</td>
<td>PL1-&gt;PL1, PL4-&gt;PL2, PL4-&gt;PL4</td>
</tr>
<tr>
<td>1-14</td>
<td>PL1-&gt;PL1, PL4-&gt;PL2, PL4-&gt;PL4</td>
</tr>
</tbody>
</table>

Figure 4 Progressive sequential-analysis transition diagrams in each stage

This study discovered that in Stage 1 (Day 1-8) not only is the extent of discussion low, as revealed by the quantitative content analysis, but there is also no significant sequential correlation between these behaviours. In Stage 2 (Day 9-11), the participants started showing continuity in initial analysis (PL1->PL1) and analysis with data collection (PL4->PL2). In the last stage, Stage 3 (Day 12-14), the participants further demonstrated continuity in analysis and report-writing (PL4->PL4). These sequences indicate the behaviours in Stage 1 are more sporadic and separated from one another, and they take up about 60% of the entire discussion time. Although initial analysis is sustained in Stage 2 (PL1->PL1), the appearance of the sequence PL4->PL2 indicates that most of the participants started to collect data after an official analysis and did not follow the expected course, such as initial analysis -> data collection -> data evaluation -> report-writing (e.g., neither PL1->PL2, PL2->PL3, PL3->PL4, nor PL2->PL4 have reached a level of significance). This finding reveals the detail information regarding the limitations in learners’ information analysis (e.g., Wallace & Kupperman, 1997; Chang & McDaniel, 1995); that is, they looked for information they needed for writing a report without first going through a systematic information analysis process, and they may have directly applied online information to official analysis and reports without proper evaluation. In Stage 3, although analysis and report-writing show continuity, they still had not reached the significance of the sequence “PL4->PL5” (comprehensive analysis) before the entire learning activity was over. The quantitative content analysis indicates that the insufficient information gathered may have limited the depth of discussion. Information on the categorization of these stages, sequences, and frequency, could serve as references for teacher intervention.

The above analyses demonstrates the limitations of students in online project-based learning in terms of time
management and information analysis, and may allow us to in-depth realize some possible causes, inter-
behaviour interactions, and those areas that require more guidance from teachers.

SUGGESTIONS
In this case study, the empirical observation and analyses indicate that participants’ limitations include poor time
management (procrastinating until the last moment) and insufficient initial data collection. The students also
demonstrated a lack of proper data evaluation processes (e.g., lack of PL1->PL2, PL2->PL3, PL3->PL4, PL2-
>PL4, or PL4->PL5, etc) and sufficient comprehensive analysis (PL5). One phenomenon observed in regard to
time management was decreased motivation to continue a given discussion, which may lead to the effect of
“dead discussion-threads” as proposed by Hewitt (2005). With little time left in Stage 3, the depth of analysis
may have also been hindered. Another important issue is that the participants did not conduct initial data-
evaluation and talk about task-coordination (PL3 and PL6 are absent), and therefore the discussion may lack a
structure or appropriate order.

The above findings could help teachers and researchers gain a better understanding of the relevant limitations in
online project-based learning, and may serve as valuable references for timely interventions. This study then
provides suggestions for teachers and educational system developers as follows:

1. A teacher may motivate students and increase the extent of discussion by providing incentives in the
initial stages of the course. To avoid the abovementioned limitation in the sequence PL4->PL2, the teacher
may post an article to remind learners not to neglect data collection (PL2) or initial data evaluation (PL3). This
may also lead to better information analysis and compilation (such as triggering the sequences PL1->PL2,
PL2->PL3, PL3->PL4, PL2->PL4, or PL4->PL5). The teacher could also consider using scaffolding (e.g., van
Rooij, 2009) by asking students to complete certain analytical procedures in a given order and review their
coordination and task delegation. As for the chain-reaction caused by numerous participants actively posting
articles, and its sustainability, the teacher is advised to notice the community’s “peripheral members” (Zhang
& Storck, 2001) and to post articles that encourage them to participate in the discussion right from the initial
stages, and to interact with other members. Since the “community climate” may also affect knowledge sharing
(Bock et al., 2005), the teacher could post articles to break the ice or settle conflicts in coordination. It is hoped
that the above recommendations can serve as valuable points of reference for teacher intervention.

2. To a developer of educational systems, the limitations in students’ co-operative project-based learning
serve as important references for the development of an automated detection system. The topic of embedding
sequential analysis detection calculation into an e-learning system deserves to be explored (Hou et al., 2010),
since the result could be an automation for the instant analysis of the frequencies and sequences of students’
behaviours. This system may also serve as a reference for teachers’ dynamic guidance and intervention.

CONCLUSION
This study aims to in-depth analyze the behavioural patterns of learners’ project-learning behaviours. This study
applied two analytical approaches: quantitative content analysis and progressive sequential analysis to explore
the behavioural patterns of learners’ online discussions. The results indicate some learners’ limitations in their
project-based learning activity. The limitations include poor time management and insufficient initial data
collection. The students also demonstrated a lack of proper data evaluation processes (e.g., lack of PL1->PL2,
PL2->PL3, PL3->PL4, PL2->PL4, or PL4->PL5) and sufficient comprehensive analysis (lack of PL5), the
suggestions for teachers and educational software developers are also proposed in the above suggestion section.
Regarding the limitations of the study, due to the limitations of the samples, this study focused more on the
project-based learning in higher education settings. This may limit generalization of findings to other grade years
or subjects. More empirical studies on different academic systems and subject domains may be explored in the
future in order to determine the similarities, differences of the behavioral patterns. Moreover, the above proposed
specific framework and techniques of automatic detection environment for online project-based learning
discussion are yet to be developed and explored by future studies.

Finally, integrating more interactive learning strategies (e.g., problem-solving, peer assessment, role playing or
peer tutoring) with project-based learning instructional activities may provides scaffolding functions to enhance
learners’ knowledge construction, and researchers may apply more coding schemes (e.g., social knowledge
construction, problem-solving process or cognitive phases) at the same time to explored the discussion content
and patterns in project-based learning for higher validity in future studies.

It is wished that the analytical methods (i.e., quantitative content analysis with progressive sequential analysis),
findings, and suggestions in this study can serve as references for teachers, researchers, and system developers
working on online project-based learning.
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