PRESERVICE SECONDARY MATHEMATICS TEACHERS’ STATISTICAL KNOWLEDGE: A SNAPSHOT OF STRENGTHS AND WEAKNESSES

Jennifer N. Lovett  
Middle Tennessee State University  
Jennifer.Lovett@mtsu.edu

Hollylynne S. Lee  
NC State University  
Hollylynne@ncsu.edu

Amid the implementation of new curriculum standard regarding statistics and new recommendations for preservice secondary mathematics teachers (PSMTs) to teach statistics, there is a need to examine the current state of PSMTs’ common statistical knowledge. This study reports on the statistical knowledge of 217 PSMTs from a purposeful sample of 18 universities across the United States. The results show that PSMTs may not have strong common statistical knowledge that is needed to teach statistics to high school students. PSMTs’ strengths include identifying appropriate measures of center, while weaknesses involve issues with variability, sampling distributions, p-values, and confidence intervals.

Keywords: Teacher Education-Preservice, Teacher Knowledge, Data Analysis and Statistics

Many have argued the need to increase students’ understanding of statistics (Shaughnessy, 2007). Accordingly, there has been recent increased emphasis on statistics content in secondary curricula standards in the U.S., informed by recommendations from the National Council of Teachers of Mathematics (2000) and the Common Core Standards for Mathematics (National Governors Association Center for Best Practice & Council of Chief State School Officers, 2010). However, a recent study of 1,249 high school students in the U.S. suggests that students are not developing a conceptual understanding of statistics (Jacobbe, Foti, Case, & Whitaker, 2014). Since many teachers, including preservice secondary mathematics teachers (PSMTs), have likely had minimal experience with statistics in their own K-12 education, they also may not have had many opportunities to develop strong statistical understandings.

The Conference Board of the Mathematical Sciences (2001, 2012) as well as the American Statistical Association (ASA, Franklin et al., 2015), present recommendations for developing statistical knowledge and pedagogy needed by preservice mathematics teachers to teach statistics. However, the lack of research focusing on the statistical knowledge of PSMTs was highlighted and called for in the 2011 International Congress of Mathematics Education Topical Study (Batanero, Burrill, & Reading, 2011). The majority of research on preservice teachers’ statistical knowledge has focused on elementary teachers (e.g. Browning, Gross, & Smith, 2014; Hu, 2015; Leavy & O’Loughlin, 2006)). The limited research conducted on PSMTs’ statistical knowledge has been small-scale studies, from a small number of institutions on specific statistical content (e.g., Doerr & Jacob, 2011; Lesser, Wagler, & Abormegah, 2014). While some smaller studies have suggested that PSMTs may struggle with statistics (e.g. Casey & Wasserman, 2015), there are no large-scale studies that describe the current state of new teachers’ statistical knowledge. This study examines the statistical knowledge of a large cross-institutional sample of PSMTs as they enter student teaching to answer the question: What are the strengths and weaknesses of PSMTs’ knowledge of the statistical content they will be expected to teach?

Framework

Groth (2013) developed a hypothetical framework for Statistical Knowledge for Teaching consisting of two domains of knowledge teachers need to develop: subject matter knowledge and pedagogical content knowledge. Developing subject matter knowledge and key developmental understandings of statistics is foundational to be able to develop pedagogical statistical knowledge.
Within subject matter knowledge there are three types: common content knowledge, specialized content knowledge and horizon knowledge. Common content knowledge refers to knowledge gained through statistics taught in school and is considered common because it refers to knowledge for daily literacy or in any profession that uses statistics. This study examines the common statistical knowledge of PSMTs since they will soon be expected to teach these common statistical ideas as part of curricula for high school students.

The Guidelines for Assessment and Instruction in Statistics Education (GAISE) Report: A Pre-K-12 Curriculum Framework (GAISE, Franklin et al., 2007) describes statistical reasoning students should develop in K-12 and suggests this reasoning develops across three levels A, B, and C. Although there are not explicit definitions given for statistical reasoning in each level, the levels increase in statistical sophistication and become more abstract. The content in Level A represents topics for early or novice learners of statistics (elementary and middle school), Level B represents slightly more advanced statistical content (middle school or early high school), and Level C represents even more advanced content (high school or introductory college courses) (Franklin et al., 2007). The GAISE report recommends that students learn statistical topics through engaging in a statistical investigative cycle consisting of: posing questions, collecting data, analyzing data, and interpreting results. Therefore, when examining PSMTs’ common statistical knowledge, it is useful to consider their understandings across these cycle phases and all three GAISE levels.

Methodology

Participating Institutions

This study focuses on PSMTs prepared through university-based teacher preparation programs in the US. Since a random sample of all mathematics teacher preparation programs was unavailable, this study began with a purposeful narrowing on PSMTs who attend institutions in which some faculty have participated in the last 13 years in particular National Science Foundation (NSF)-funded or ASA-funded programs to increase the emphasis of statistics education at that institution. Faculty from 57 institutions participated in the NSF-funded program, Preparing to Teach Mathematics with Technology (PTMT, ptmt.fi.ncsu.edu), and/or the ASA-funded Math/Stat Teacher Education: Assessment, Methods, and Strategies (TEAMS, www.amstat.org/sections/educ/newsletter/v9n1/TEAMS.html) conference between 2002-2014. These institutions were chosen since faculty members received professional development focusing on explicit content and strategies for preparing PSMTs to teach statistics. Our assumption was that PSMTs from these institutions may have had opportunities to engage in statistics content and pedagogy activities in their coursework.

The sample was obtained by contacting all 57 institutions through their undergraduate program coordinator for mathematics education to inquire if the program was interested in participating. Twenty-four programs expressed interest, and 18 participated. The coordinator identified the last mathematics teaching methods course PSMTs take before student teaching, which would constitute the data collection point in either fall 2014 or spring 2015. Of the 18 institutions, all but one were public institutions. The majority of institutions (61.1%) had an Carnegie Classification™ (Carnegie Foundation for the Advancement of Teaching, 2011) enrollment profile of high undergraduate. Approximately 84% of participants attended institutions with a basic classification of Research Universities/Very High, Research University/High or a Master’s college and university with a larger program.

Participants

Across 18 institutions, there were 221 PSMTs recruited by their mathematics teaching methods instructor to take the assessment of their statistical understanding, described in the next section, as an
assignment as part of the course. Those who took exceptionally less time (10 minutes) than recommended by authors of the assessment were eliminated (Jacobbe, personal communication). This resulted in a sample size of 217 PSMTs. The PSMTs were undergraduate juniors and seniors, or graduate students earning initial licensure; all were enrolled in their last mathematics education course prior to student teaching. The number of PSMTs participating from each institution ranged from 2 to 31, with a mean of 12. Fourteen institutions had 100% participation of PSMTs who were eligible to participate, with the remaining four institutions having between one and four students who did not complete the assignment. The majority of PSMTs were female (71%), and 88% were Caucasian. Almost all (93.4%) reported they had taken at least one statistics course at their institution or had completed Advanced Placement Statistics in high school.

Data Collection and Analysis

To examine PSMTs’ common statistical knowledge, the Levels of Conceptual Understanding of Statistics (LOCUS) assessment (Jacobbe, Case, Whitaker, & Foti, 2014) was administered online (locus.statisticseducation.org). The LOCUS instrument assesses understanding of statistics across the three GAISE levels of development and also assesses understanding within each phase of an investigative cycle: formulating questions, collecting data, analyzing data, and interpreting results. Participants took the 30 multiple choice Intermediate/Advanced Statistical Literacy version of the assessment, which was designed for students in grades 10 – 12. The test consists of two level A questions, 11 level B questions, and 17 level C questions. This version has been validated and reliable with students in grades 6-12 to assess statistical knowledge across levels B and C and the four phases of the investigative cycle (Jacobbe, personal communication); while this instrument is not intended as a high stakes assessment of knowledge, it does represent the statistics content PSMTs are expected to teach their students in the near future. Thus, teachers are expected to score fairly high on the assessment. While actual test items cannot be released due to test security, sample items for the four categories at different levels are available on the LOCUS website (locus.statisticseducation.org/professional-development). Each test-taker receives an overall score (percent correct), as well as sub-scores for Level B, Level C, Formulating Questions, Collecting Data, Analyzing Data, and Interpreting Results.

To examine the statistical knowledge demonstrated by PSMTs, descriptive statistics were computed for the overall score and each subscore. Paired samples t-tests were used to test for significance of PSMTs’ statistical knowledge between GAISE Levels B and C and a repeated measures ANOVA used to test for significant differences in PSMTs’ statistical knowledge between the four phases of a statistical investigation. An item analysis was conducted to closely examine PSMTs’ strengths and weaknesses.

Results

Trends in scores on the LOCUS test can help in describing what PSMTs from these 18 universities currently understand about the statistics content they will soon be responsible for teaching. The summary statistics for PSMTs’ scores are reported in table 1. With a mean overall score of 69%, and a standard deviation of 14.06, PSMTs do not seem to demonstrate a conceptual understanding of the statistical content they will teach high school students. PSMTs scored, on average, significantly higher on Level B questions than on Level C questions (t=5.772, p<0.001), demonstrating that their statistical knowledge is weaker as items increase in sophistication. The distribution of PSMTs’ scores is shown in figure 1. The boxplots show that for the overall scores and subscores, there are at least some PSMTs who scored between 90-100% correct, indicating that they likely have strong common statistical knowledge of topics they will soon be responsible to teach. However, there is a concern since only one-quarter of PSMTs scored overall above 77%, and a
quarter scored below 57% overall. The variation in scores seems somewhat similar for Level C scores. However, higher standard deviation in Level B scores is likely due to the increased quantity of low scoring individuals, indicated as outliers in figure 1.

### Table 1: PSMTs’ Percent Correct on LOCUS Instrument

<table>
<thead>
<tr>
<th>Overall Score</th>
<th>Number of items</th>
<th>Mean</th>
<th>SD</th>
</tr>
</thead>
<tbody>
<tr>
<td>Overall Score</td>
<td>30</td>
<td>68.61</td>
<td>14.06</td>
</tr>
<tr>
<td>GAISE Levels</td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Level B Score</td>
<td>11</td>
<td>70.85</td>
<td>17.69</td>
</tr>
<tr>
<td>Level C Score</td>
<td>17</td>
<td>64.87</td>
<td>14.16</td>
</tr>
<tr>
<td>Phases of Statistical Investigative Cycle</td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Formulating Questions</td>
<td>7</td>
<td>70.40</td>
<td>19.70</td>
</tr>
<tr>
<td>Collect Data</td>
<td>7</td>
<td>63.34</td>
<td>22.22</td>
</tr>
<tr>
<td>Analyze Data</td>
<td>11</td>
<td>60.48</td>
<td>16.25</td>
</tr>
<tr>
<td>Interpret Results</td>
<td></td>
<td></td>
<td></td>
</tr>
</tbody>
</table>

**Figures 1 and 2.** Distribution of PSMTs’ LOCUS scores

Examining subscores by phases in the statistical investigative cycle, PSMTs scored higher on average on Formulating Questions and lower as the cycle progresses, scoring lowest on Interpreting Results items (Table 1). A repeated measures ANOVA determined that mean scores differed significantly between scores for the four phases [$F(3,648)=64.73, p<0.001$]. Post hoc tests using a Bonferroni correction revealed that PSMTs scored significantly lower as the cycle progressed ($p<0.001$). However, there was only a slight difference between mean scores for Analyze Data and Interpret Results ($p=0.32$). The distribution of scores across the four phases is shown in figure 2. The boxplots show that for all four phases, there are again some PSMTs who scored between 90-100%, indicating that those PSMTs likely have the common content knowledge that will be needed when teaching that phase of the investigative cycle. On Formulating Questions items, at least half of PSMTs scored 80% or higher, and a quarter of those scored 100%, indicating stronger understanding for these PSMTs about Formulating Questions. However, half of PSMTs scored below 71% on Collecting Data and Analyzing Data items, and half scored below 64% on Interpreting Results items. Even being conservative, this result is convincing that the majority of these PSMTs do not have the common statistical knowledge that can provide a foundation for teaching students key concepts related to Collecting Data, Analyzing Data, and Interpreting Results.
Item Analysis
Upon further analysis of individual items classified by the statistical investigative cycle, themes emerged concerning PSMTs’ strengths and weakness. As previously mentioned, PSMTs scored the highest on average for Formulating Questions items, with no common misunderstanding identified. As an example of their strength in understanding this phase, PSMTs were able to read a description of a study and measurements taken to identify an appropriate statistical question of interest.

Collecting Data. On average, PSMTs scored the next highest on Collecting Data items. PSMTs were able to identify ways to improve a study design given a study and measurements, identify which study design would be best based on a question of interest, and identify a data collection plan based on a study description. Thus, these PSMTs seem to have strong common content knowledge related to the design of a statistical study.

Even though PSMTs were able to develop a data collection plan, they struggled more when asked to identify how to choose a sample to minimize bias. Only 64.5% were able to choose a correct sampling method; instead, 30% chose a convenience sample or a stratified sample that seemed complicated but was not random. Thus, they do not seem to have a strong understanding of the role of an appropriate sampling method within the design of a study. Another common misunderstanding of PSMTs was the conclusion that could be drawn from a specific study design. Figure 3 is a similar item to the one PSMTs were asked on the assessment. Over 58% of PSMTs chose an answer similar to answers (A) and (C) that allowed a researcher to generalize results to an entire population based on a sample of volunteers. These findings highlight PSMTs’ need for a deeper understanding related to ways in which study designs and data collection processes impact the conclusions that can be drawn.

Analyzing Data. PSMTs’ average scores for Analyzing Data items were the second lowest among the phases, and had the highest variability. PSMTs demonstrated that they understand which measure of center is appropriate for a given context, how measures of center and variation change when data values are changed, and a justification of an association from a two-way table. However, PSMTs demonstrated more difficulty with Analyze Data items that involved understanding of variation in data. Only 43% of PSMTs could identify a histogram containing data that varied the least from its mean. Instead 30% of PSMTs chose a uniform distribution and about 20% thought variability from the mean was the same for all three distributions. PSMTs demonstrated another misunderstanding related to expected variation in sample means when repeatedly sampling from a population. When given the distribution of a population and population mean, 36% of PSMTs could not identify the distribution of sample means. Instead they chose distributions that resembled the

Figure 3. Sample Collect Data item from locus.statisticseducation.org.


Articles published in the Proceedings are copyrighted by the authors.
general shape of population distribution. These results point to PSMTs’ need for more common content knowledge in regards to variation, sample distributions, and distribution of sample statistics.

Interpret Results. PSMTs scored the lowest on average on Interpret Results items. However, on five of the eleven Interpret Results items, 84% or more of PSMTs answered the items correctly. PSMTs were able to compare distributions in a context using the center and spread, demonstrate an understanding of the effect of sample size on a sample mean, and interpret survey results with a given margin of error. These are important concepts often taught in middle and high school curricula. On the other six Interpret Results items, the percentage of PSMTs responding correctly to these items ranged from 21% to 48%, and their misunderstandings were related to ideas of formal inference. PSMTs struggled most with statistical significance, identifying and interpreting a p-value, and explaining confidence intervals. About half (48%) of PSMTs were able to correctly interpret results given a large p-value and fail to reject the null hypothesis (Figure 4). However, 40% of PSMTs chose a conclusion that a large p-value meant they could reject the null hypothesis.

On another item regarding p-value, PSMTs were asked to reason if a p-value would be large or small for comparing means of two distributions given data on a dotplot. Only 35% of PSMTs were able to correctly identify that the p-value would be small due to the large gap between distributions. Almost 47% incorrectly answered that the p-value would be large due to a large gap between the distributions. These findings demonstrate that PSMTs on average do not have an understanding of what it means to be statistically significant and what a p-value represents, aspects of common content knowledge expected in statistics, and included in many high school curricula.

The item PSMTs had the most difficulty with in Interpreting Results asked the test taker to explain the meaning of a 95% confidence interval for a mean. Approximately one-fifth chose the correct response that a 95% confidence interval represents that 95% of confidence intervals constructed from random samples would capture the true mean. Almost half of PSMTs chose the response that there was a 95% probability that the mean was in between the lower and upper limits of the confidence interval. These misunderstandings highlight the need for PSMTs to have more experiences with interpreting and understanding confidence intervals.

Discussion and Conclusion

Our study was situated within a purposeful sample of PSMTs enrolled in teacher education programs where a faculty member had participated in professional development projects that promoted increasing attention to statistics in secondary mathematics education courses. It is not known exactly how those teacher education programs currently include an emphasis on statistics, nor exactly what these PSMTs experienced at all 18 institutions. Nonetheless, there are several findings of this study that are significant to consider. Our results provide empirical evidence that PSMTs in this study generally do not exhibit a strong common content knowledge of many aspects of statistics.

needed for teaching high school students, and in particular they struggle more with the later phases of a statistical investigation. Previous research has shown a similar trend with inservice teachers and students measured by LOCUS (Jacobbe, 2015; Jacobbe, Foti, et al., 2014). Thus, PSMTs need more experiences in collecting data, analyzing data and interpreting results to develop a deeper understanding of all aspects of the statistical investigative cycle and to develop common statistical knowledge needed for teaching.

PSMTs exhibit some similar strengths and weaknesses with concepts that high school and introductory college students develop. An important strength that PSMTs demonstrated is that they are proficient at identifying an appropriate measure of center for a given context. PSMTs’ strength in understanding measures of center suggests they should be well equipped to assist their future students develop stronger conceptions. PSMTs’ weaknesses involve issues with variability, sampling distributions, p-values, and confidence intervals. Many researchers have identified that these topics are also often misunderstood by many students in undergraduate statistics courses (e.g., Aquilonius & Brenner, 2015; Castro Sotos, Vanhoof, Van de Noortgate, & Onghena, 2007; delMas, Garfield, Ooms, & Chance, 2007); thus, PSMTs’ common statistical knowledge may be no better than those of other college students not preparing for teaching.

These findings, even though from a purposeful sample, suggest there is a critical need for mathematics teacher education programs to reevaluate the opportunities PSMTs’ have to increase their common statistical knowledge. Our results specifically indicate that effort should focus on developing PSMTs’ knowledge of variability, sampling distributions, and formal inference, particularly as they are applied in the analyzing data and interpreting results phases of an investigative cycle. While this study only reports on one aspect of PSMTs’ statistical knowledge for teaching, the larger study (Lovett & Lee, 2017) provides more details about PSMTs’ confidence to teach and the experiences they perceived had contributed to their confidence and understandings in statistics. Additional large-scale studies are needed on all aspects of PSMTs’ statistical knowledge for teaching and the impact that teacher education programs have on PSMTs’ preparedness to teach statistics.

References


Articles published in the Proceedings are copyrighted by the authors.