

## A Sequence of Activities for Developing Statistical Concepts

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#### Introduction

The Board of Directors of the American Statistical Association (ASA) at its May 2005 meeting endorsed the report, "A Curriculum Framework for Pre K-12 Statistics Education." The development of this *Framework* was supported by the ASA though funding of a Strategic Initiative Grant proposed by the ASA Advisory Committee on Teacher Enhancement. The *Framework* is designed to give educators guidance towards developing statistically literate citizens. The writers of the *Framework* were Christine Franklin, Gary Kader, Denise Mewborn, Jerry Moreno, Mike Perry, Roxy Peck, and Richard Scheaffer.

### The Framework Model

# Statistical Problem Solving and the Evolution of Statistical Concepts

The *Framework* presents statistical problem solving as an investigative process that involves four components:

- (1) Question formulation,
- (2) Data collection,
- (3) Data analysis,
- (4) Interpretation.

The *Framework* stresses the importance of understanding variability in the practice of this process. The formulation of a statistics question requires an understanding of the difference





between a question that anticipates a deterministic answer and a question that anticipates an answer based on data that vary. The anticipation of variability is the basis for understanding this distinction. Data collection designs must acknowledge variability in data and frequently are intended to reduce variability. An understanding of data collection designs that acknowledge variability is required for effective collection of data. The main purpose of statistical analysis is to give an accounting of the variability in the data. Accounting for variability with the use of distributions is the key idea in the analysis of data. Statistical interpretations are made in the presence of variability and must allow for it. Looking beyond the data to make generalizations must allow for variability in the data.

Understanding the role of variability in the statistical problem solving process requires maturation in statistical thinking. The beginning student cannot be expected to make all of these linkages. Statistical education should be viewed as a developmental process, and this report provides a framework for statistical education over three developmental levels, A, B, and C. Although these three levels may parallel grade levels, they are based on development in statistical thinking, not age. Thus, a middle school student who has had no prior experience with statistics will need to begin with Level A concepts and activities before moving to Level B. This holds true for a secondary student as well. If a student hasn't had Level A and B experiences prior to high school, then it is not appropriate to jump into Level C expectations. The learning is more teacher-driven at Level A, but becomes student driven at Levels B and C.

The *Framework* presents a conceptual structure for statistics education in a two-dimensional model. One dimension is defined by the components of the statistical problem-solving process along with the nature of and the focus on variability. The second dimension is comprised of three developmental levels. In this article we will investigate a problem from the *Framework* that demonstrates the statistical problem-solving process across the developmental levels and illustrates how statistical concepts evolve over the three levels.

# The Problem – What's your favorite type of popular music?

Almost all students have an interest in popular music. However, there are many different kinds of popular music, not all students like the same kind of music, and students' tastes in music may change over time. In planning for a class party or a school dance, it would be useful to know which kind of popular music is appealing to most students. Preceding the investigation of this problem at each level, the overall objectives that level will be given followed by the specific recommendations that will be illustrated through the investigation.

## LEVEL A Objectives of Level A

Children are surrounded by data. It is in Level A that children need to develop data sense -- an understanding that data can be used to answer questions and that statistics is involved with collecting data to address the question at hand, organizing and summarizing the data in various ways, and interpreting the data to provide an answer to our question. Students at Level A:

- Should have opportunities to generate questions about a particular context (such as their classroom) and determine what data might be collected to answer these questions.
- Should learn how to use basic statistical tools to analyze the data and make informal or casual inferences in answering the posed questions.
- Students should develop basic ideas of probability in order to support their later use of probability in drawing inferences at Levels B and C.

The specific Level A recommendations addressed in the favorite-type music investigation as they relate to the statistical solving process are:

1. Formulate the Question

Teachers help pose questions (Questions in contexts of interest to the student) Students distinguish between statistical solution and fixed answer

- 2. Collect Data to Answer the Question Students conduct a census of the Classroom
- 3. Analyze the Data

Students compare individual to individual Students compare individual to a group Students understand the idea of a distribution Students describe a distribution Students use tools for exploring distributions including:

Picture Graph Frequency Table and Bar Graph Modal Category

4. Interpret Results

Students draw conclusions about their class

### Investigation 1: Choosing the Music for the End of the Year Party – Conducting a Census

In planning an end of year party, children at Level A would be interested in the exploring the favorite type of music among students in their class. The class might investigate the question:

## *What type of music is most popular among students in our class?*

This question attempts to measure a characteristic of the children who will attend the party. The characteristic, favorite music type, is a *categorical variable* - each child in that grade would be placed in a particular non-numerical category based on his or her favorite music type. A Level A class might conduct a *census* of the students in their classroom to gauge what type of music should be played at the party.

A *picture graph* is one graph that should be introduced at Level A to represent the results for each category. A picture graph uses a picture of some sort of object (such as a guitar) to represent each response to the question. Alternatively, a "dot", an "X", or a "stick note" can be used instead of a picture. Each child would put the picture over her/his response. The picture might even include the student's name so that each student's preference can be identified from the graph. For example, a child who prefers 'Country' would go to the board and place a guitar above the column labeled "Country." In creating a picture graph, there is a deliberate recording of each element one at a time. The picture graph for data from a first grade class with 24 students is shown in Figure A1.

Notice that a picture graph does not have a vertical axis and that the different categories are listed along the horizontal axis. After creating a picture graph, students might use *tally marks* to count the number of responses for each category. Figure A1: Picture Graph of Our Favorite Type of Tunes



At Level A, students should recognize that there is variability in responses or measurements from individual-to-individual, and a picture graph provides an illustration into the nature of this variability. Young children will naturally identify the value that occurs most frequently in a picture graph. This quantity is called the *mode*. In the favorite-music example, the most popular type of music was Pop preferred by 12 students, so the mode (or modal category) is pop music. Students could use this information to determine the type of music to play at the end of the year party. As students develop through Level A, they should progress from representing data in relatively simple ways, such as a picture graph and/or tallying, to representations that are more summative in nature.

For example, the counts from tallying data summarized in a picture graph could be summarized in a table. Table A1 is the *frequency count table* for the favorite-music example data summarized in the Picture Graph in Figure A1.

#### Table A1—Frequency Count Table

| <u>Favorite</u> | Frequency or Count |
|-----------------|--------------------|
| Country         | 8                  |
| Рор             | 12                 |
| Rock            | 4                  |

A frequency bar graph is a graph that illustrates categorical data that has been summarized in a frequency count table. A bar graph has two axes (horizontal and vertical). The different possible categories are listed along horizontal axis and the vertical axis is scaled to accommodate the frequencies for the different categories. Over each category on the horizontal axis, a rectangle reaching up to the desired count is drawn. The bar graph below is for the data summarized in Table A1 for the favorite-music data.

Note that each student's individual response is no longer available from these representations. For this reason, a frequency count table and its corresponding bar graph are called summative representations for data. However, using either Table A1 or Figure A2, the number of students who responded in each category can be determined, and students can determine that the most popular type of music was pop music and that the least popular music was rock. This informa-

Figure A2: Bar graph of music preferences

#### **Favorite Type of Music**



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tion can be used by the students to recommend the playing of pop music at the end of year party.

### Transitioning from Level A to Level B

As students transition from Level A toward Level B they should begin to make use of representations of data that require the use of multiplicative or proportional reasoning. For example, a picture graph (used in Level A) refers to a graph where a symbol is used to represent one response. A *pictograph* is a similar display in which one symbol is used to represent more that one response. For example, each guitar over a category might represent the two responses, in which case a "half" a guitar would represent one response. A Level B student should have the mathematical maturity to interpret a pictograph.

Another standard graph for summarizing categorical data is a circle graph or pie chart. The circle for the favorite-music example is shown in Figure A3.

#### Figure A3: Circle Graph

#### **Favorite Type of Music**



Notice that this pie graph does not include the counts for each group. However, students should observe that based on this graph, half the students prefer pop music, more that a quarter prefer country and less than a quarter prefer rock. Since a circle graph requires a basic understanding of proportional reasoning, they should only be used as students transition from Level A to Level B statistics.

For many situations it is useful to report not only the count (frequency) of each response but to also give the count *relative* to the total number of responses. These *relative frequencies* are often reported as percentages. The relative frequency table reports these percentages and the vertical axis on the corresponding bar graph is scaled to accommodate these percentages. For example, the relative frequency table and bar graph for the favorite-music example are shown below in Table A2 and the relative frequency histogram is shown is Figure A4. **Table A2**—Relative Frequency Table for FavoriteType of Music

| <u>Favorite</u> | <b>Percentage</b> |
|-----------------|-------------------|
| Country         | 33%               |
| Pop             | 50%               |
| Rock            | 17%               |

Expressing counts as percentages is useful in that the percentages allow us to think of having comparable results for groups of size 100. Once again, as students transition from Level A to Level B, they need experiences that allow them to use proportional or multiplicative reasoning.

#### LEVEL B

#### **Objectives of Level B**

Instruction at Level B should build on the statistical base developed at Level A and set the stage for statistics at Level C. Instructional activities at Level B should continue to emphasize the four main components in the investigative process and should have the spirit of genuine statistical practice. Students who complete Level B should see statistical reasoning as a process for solving problems through data and quantitative reasoning. At Level B:

- Students become more aware of the statistical question distinction (a question with an answer based on data that vary versus a question with a deterministic answer).
- Students make decisions about what variables to measure and how to measure them in order to address the question posed.
- Students use and expand the graphical, tabular and numerical summaries introduced at Level A to investigate more sophisticated problems.

#### Figure A4: Percentage Bar Graph

#### **Favorite Type of Music**



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- Students develop a basic understanding of the role that probability plays in random selection when selecting a sample and in random assignment when conducting an experiment.
- Students investigate problems with more emphasis placed on possible associations among two or more variables and understand how a more sophisticated collection of graphical, tabular and numerical summaries is used to address these questions.
- Students recognize ways that statistics is used or misused in their world.

The specific Level B recommendations addressed in the favorite-type music investigation as they relate to the statistical solving process are:

1. Formulate Questions

Students begin to pose their own questions.

Students address questions involving a group larger than their classroom and begin to recognize the distinction among a population, a census, and a sample.

#### 2. Collect Data

Students conduct censuses of two or more class-rooms.

3. Analyze Data

Students expand their understanding of a data distribution.

Students compare two or more distributions using graphical displays and summary measures.

Students explore association between two variables.

4. Interpret Results

Students acknowledge that a sample may not be representative of a larger population.

Students understand basic interpretations of measures of association.

Students recognize sampling variability in summary measures such as the sample mode and the sample proportion. Figure B1: Comparative bar graphs for music preferences

#### Bar Graph of Percentage of Favorite Music Type by Class



# Investigation 2: Choosing a Band for the School Dance

In planning for a school dance, a Level B class might investigate the questions:

What type of music is most popular among students at our school?

*How do the favorite types of music differ between different classes?* 

In the favorite-type of music problem from Level A, the class was considered to be the entire population and data were collected on every member of the population. A similar investigation at Level B would include recognition that one class may not be representative of the opinions of all students at their school, and Level B students might want to compare the opinions of their class with other classes from their school.

Since class sizes may be different, in order to make comparisons, results should be summarized with relative frequencies. Level B students will see

more emphasis on multiplicative and proportional reasoning throughout the mathematics curriculum, and they should be comfortable summarizing and interpreting data in terms of percentages or fractions.

The results from two classes are summarized in the Table B1 using both frequency counts and relative frequency percentages.

Notice that no students at Level B identified "Pop" as their favorite music, but

| Table B1—Frequency      | counts and | relative | frequency | percentages |
|-------------------------|------------|----------|-----------|-------------|
| I able bi - I requericy | counts and | ICIALIVE | nequency  | percentages |

| Class 1  |           |                                     | Class 2  |           |                                     |
|----------|-----------|-------------------------------------|----------|-----------|-------------------------------------|
| Favorite | Frequency | Relative<br>Frequency<br>Percentage | Favorite | Frequency | Relative<br>Frequency<br>Percentage |
| Country  | 8         | 33%                                 | Country  | 5         | 17%                                 |
| Rap      | 12        | 50%                                 | Rap      | 11        | 37%                                 |
| Rock     | 4         | 17%                                 | Rock     | 14        | 47%                                 |
| Total    | 24        | 100%                                | Total    | 30        | 101%                                |

many did include "Rap." The comparative bar graph in Figure B1 compares the percentage of each favorite music category for the two classes.

Students at Level B should begin to recognize that there is not only variability from one individual to another within a group, but that there is variability in results from one group to another. This second type of variability is illustrated by the fact that in Class 1 the most popular music is rap music while in Class 2 it is rock music. That is, the mode for Class 1 is rap music, while the mode for Class 2 is rock music.

#### **Connecting Two Categorical Variables**

Since rap was the most popular music for the combined two classes, the students might argue for a rap band for the dance. However, more than half of those surveyed prefer either rock or country music. Will these students be unhappy if a rap band is chosen? Not necessarily since many students who like rock (or country) music may also like rap music as well. To investigate this problem, students might explore an additional question.

## Do students who like rock music tend to like or dislike rap music?

To address this question, the survey should ask students not only their favorite type of music, but also whether or not they like rap, rock, and country music.

The *two-way frequency table* (or *contingency table*) in Table B2 provides a way to investigate possible connections between two categorical variables.

|                | Lik      |     |    |               |
|----------------|----------|-----|----|---------------|
|                |          | Yes | No | Row<br>Totals |
| Like           | Yes      | 27  | 6  | 33            |
| Rock<br>Music? | No       | 4   | 17 | 21            |
| Columr         | n Totals | 31  | 23 | 54            |

Table B2—Two-way frequency table

According to these results, of the 33 students who liked rock music, 27 also liked rap music. That is, 82% (27/33) of the students who like rock music also like rap music. Figure B2 shows a *segmented bar graph* for the data summarized in Table B2. The display provides a visual display of the percentage students who like rap music across those students who like rock music and those students who do not like rock music.

These results indicate that students who like rock music tend to like rap music as well, and that students who do not like rock tend to not like rap. That is, there appears to be an *association* (connection) between liking rock music and liking rap music. Once again, notice the use of proportional reasoning in

Figure B2: Segmented Bar Graph

100% 90% 80% 70% Percentage 60% No. 50% Yes 40% 30% 20% 10% 0% Yes No Like Rock Music?

**Percent Who Like Rap Music** 

interpreting these results. A similar analysis could be performed to determine if students who like country tend to like or dislike rap music.

#### Transitioning from Level B to Level C

The results from the two classes summarized in Table B1 might be combined in order to have a larger sample of students from the entire school. The combined results indicate that rap music was the favorite type of music for 43% of the students, rock music was preferred by 33%, while only 24% of the students selected country music as their favorite. Level B students should recognize that although this is a larger sample, it still may not be representative of the entire *population* (all students at their school). In statistics, randomness and probability are incorporated into the sample selection procedure in order to provide a method that is fair and to improve the chances of selecting a representative sample. For example, if the class decides to select what is called a simple random sample of 54 students, then each possible sample of 54 students has the same probability of being selected. This application of probability illustrates one of the roles of probability in statistics. Although Level B students may not actually employ a random selection procedure for investigating this problem, issues related to obtaining representative samples should be discussed at this level. This is especially important as students transition from Level B to Level C and as they begin understand the role that probability and random variability plays in the decision making process in statistics.

As indicated earlier, Level B students should recognize that the value of sample summary measures, such as the proportion of students who like rap music, will vary from one sample to another. If random samples of the same size are repeatedly selected, recognizing and understanding the pattern in variation for the values of the sample proportion that should occur is crucial in making the transition to inferential statistics, the primary focus at Level C. One type of statistical inference relates to conjectures (hypotheses) made before the data were collected. Suppose in the favorite-music example, a student says "I think more than 40% of the students in the school like rap music." Notice that in the sample, 43% prefer rap music, which supports the claim, but since the sample proportion varies from one sample to another, this does not conclusively indicate the more that 40% of all students prefer rap music. The statistical question then is how strong is the sample data in support this claim?

To explore this problem, students might set up a hypothetical population that has 40% successes (likes rap music) and repeatedly simulate taking random samples of size 54 from it. One way to do this is to use a 10-sided die, which should produce the digits 0,1,2,3 about 40% of the time. Each time a 0, 1, 2, or 3 occurs, this corresponds to someone responding "rap", otherwise, the response is "not rap". Have each student toss the die 54 times and determine the percent of times the digits 0-3 occur. Another way to do this simulation is to use a random number generator or table, which should produce the digits 0,1,2,3 about 40% of the time. So, students might generate 54 random digits and determine the percent of digits 0-3 that occur. The distribution of percents generated from 100 such simulations will be similar to the one in Figure B3. This distribution is called the *empirical sampling* distribution of the sample percent. The distribution illustrates the nature of the behavior of the sample percent when random samples of size 54 are repeatedly selected from a population with 40% successes. The key points here are for students to recognize that:

- the sample proportion varies from one sample to another,
- when selecting random samples, a recognizable pattern emerges in the distribution, and
- many samples have 43% percent and even higher percentages occurring.

**Figure B3:** Sample Percentages for 100 Samples of Size 54 from a Population with 40% Successes LEVEL C



The final point above is important in the development of statistical thinking. The fact that 43% or more preferring rap music is quite common in samples of size 54 when the population has only 40% who prefer rap music suggests that the sample evidence supporting the student's conjecture that "more than 40% prefer rap" is not very strong.

#### **Objectives of Level C**

Level C is designed to build on the foundation developed in Levels A and B. At Level C, additional concepts are developed for the interpretation and the use of statistical methods to answer questions. Level C recommendations include:

- Students should be able to formulate questions and determine how data can be collected and analyzed to provide an answer.
- Students should understand what constitutes good practice in conducting a sample survey.
- Students should understand what constitutes good practice in conducting an experiment.
- Students should understand what constitutes good practice in conducting an observational study.
- Students should be able to design and implement a data collection plan for statistical studies, including observational studies, sample surveys, and simple comparative experiments.
- Students should be able to summarize numerical and categorical data using tables, graphical displays, and numerical summary statistics such as the mean and standard deviation.
- Students should understand how sampling distributions (developed through simulation) are used to describe sample-to-sample variability.
- Students should be able to recognize association between two categorical variables.
- Students should be able to describe relationships between two numerical variables using linear regression and the correlation coefficient.
- Students should understand the meaning of statistical significance and the difference between statistical significance and practical significance.
- Students should understand the role of P-values in determining statistical significance.
- Students should be able to interpret the margin of error associated with an estimate of a population characteristic.

The specific Level C recommendations addressed in the favorite-type music investigation as they relate to the statistical solving process are:

1. Formulate Questions

Students address questions involving a group

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larger than their classroom and begin to recognize the distinction among a population, a census, and a sample.

2. Collect Data

Students design and conduct random sample surveys.

3. Analyze Data

Students expand their understanding of a data distribution.

Students compare two or more distributions using graphical displays and summary measures.

Students explore association between two variables.

4. Interpret Results

Students understand sampling variability in summary measures such as the sample proportion. Students understand the role of P-values in determining statistical significance.

# Investigation 3: A Survey of Music Preferences

A survey of student music preferences was introduced at Level A, where the analysis consisted of making counts of student responses and displaying the data in a bar graph. At Level B the analysis was expanded to consider relative frequencies of preferences between two classes and the responses for two types of music were cross-classified and displayed in a two-way table. In order to be able to generalize to all students at the school, a representative sample of students from a school is needed. This could be accomplished by selecting a simple random sample of 50 students from the school. The results can then be generalized to the school (but not beyond) and the Level C discussion will center on basic principles of generalization, or statistical inference.

A Level C analysis begins with a two-way table of counts that summarizes the data on two of the questions, "Do you like rock music?" and "Do you like rap music?" The table provides a way to examine the responses to each question separately as well as a way to explore possible connections (association) between the two categorical variables. Suppose the survey data resulted in the two-way table shown in Table C1.

| Table C1—Two-wav freque |
|-------------------------|
|-------------------------|

|               |     | Like Roc | k Music? |            |
|---------------|-----|----------|----------|------------|
|               |     | Yes      | No       | Row Totals |
| Like<br>Ran   | Yes | 25       | 4        | 29         |
| Music?        | No  | 6        | 15       | 21         |
| Column Totals |     | 31       | 19       | 50         |

# Figure C1: Dotplot of Empirical Sampling Distribution



As demonstrated at Level B, there are a variety of ways to interpret data summarized in a two-way table such as Table C1. Some examples based on all 50 students in the survey include:

25 of the 50 students (50%) liked both rap and rock music.

- 29 of the 50 students (58%) liked rap music.
- 19 of the 50 students (38%) did not like rock music.

One type of statistical inference relates to conjectures (hypotheses) made before the data were collected. Suppose a student says "I think more than 50% of the students in the school like rap music." The statistical question then is whether the sample data support this claim or not. One way to arrive at an answer is to set up a hypothetical population that has 50% successes (like even and odd digits produced by a random number generator) and repeatedly take samples of size 50 from it, each time recording the proportion of even digits. The empirical sampling distribution of proportions so generated will be similar to the one in Figure C1.

A sample proportion greater than or equal to the observed .58 occurs 12 times out of 100 just by chance when the actual population proportion is only .50. This suggests that the result of .58 is not a very unusual occurrence when sampling from a population with .50 as the "true" proportion of students who like rap music, so the evidence in support of the student's claim is not strong enough. A population value of .50 (or maybe even something larger) is plausible based on what was observed in the sample. The fraction of times the observed result is matched or exceeded (.12 in this investigation) is called the approximate *p-value*. The p-value represents the chance of observing a sample result as extreme as the one observed in the sample when the hypothesized value is in fact correct.

A small p-value would have supported the student's claim, because this would have indicated that if the population proportion was .50, it would have been very unlikely that a sample proportion of .58 would have been observed.

Another type of question we investigated at Level B on student preferences on music is of the form "Do those who like rock music also tend to like rap music?" In other words, is there an association between liking rock music and liking rap music? The same data from the random sample of 50 Level C students can be used to answer this question.

According to Table C1 a total of 31 students in survey liked rock music. Among those students, the proportion who also like rap music is (25/31) = .81. Among the 19 students who do not like rock music, 4/19 = .21 is the proportion who like rap music. The large difference between these two proportions (.60) suggests that most students who like rock also like rap. There appears to be a strong association between liking rock music and liking rap music.

But could this association simply be due to chance (a consequence only of the random sampling)? If there were no association between the two groups the 31 students who like rock would behave as a random selection from the 50 in the sample. To simulate this situation we make up a population of 29 1's (those who like rap) and 21 0's (those who do not like rap) and mix them together. Then, we select 31 (representing those who like rock) at random and see how many 1's (those who like rap) we get. It is this entry that goes into the (yes, yes) cell of the table, and from that data the difference in proportions can be calculated. Repeating the process many times produces a simulated sampling distribution for the difference between two proportions, as shown in Figure C2.

The observed difference of .6 was never reached in 100 trials, indicating that the observed difference cannot be attributed to chance alone. There is evidence of a real association between liking rock music and liking rap music.

#### Summary of the Three Investigations

At each of the three maturation levels, the "favoritemusic" scenario has allowed us to demonstrate the sta-

## Sidebar Another Problem - Purchasing Tee Shirts

In the music problem investigation, data were collected and analyzed on several categorical variables. Many problems require data on numerical variables. For example, an elementary grade level class might be planning an order of long-sleeve tee shirts with the school logo. The shirts come in various sizes and sleeve lengths. To simplify measuring arm length, the manufacturer asks that the arm span (from finger tip to finger tip) be measured in centimeters. In planning for the order, a Level A class might investigate the statistics question: *How do the arm spans for students in our class vary?* 

This question requires data on the numerical variable arm span for each child in the class. A useful graph for summarizing numeric data is the dot plot. A dot plot is obtained by scaling a horizontal axis from the minimum to maximum measurements and placing a "dot" or an "X" over each student's measurement. Figure 5A displays data on the arm spans from a third grade class with 27 students. We will use these data throughout this investigation at Levels B and C.



When describing a distribution for numeric data, students should focus on three general properties - center, shape, and spread. Additionally, students should identify any interesting features of the distribution as well as any unusual observations. Based on the dot plot, these arm spans appear to be centered around 120 cm in a fairly symmetric manner. The arm spans have a wide range of 145 - 92 = 53cm, indicating a lot of spread or variability in the data. However, 19 of the 27 arm spans are contained in two clusters with fairly narrow ranges. The first cluster (111 cm to 118 cm) has 9 values and the second cluster (122 to 126 cm) has 10 values. There appears to be one usually short arm span (92 cm) and two fairly large arm spans (136 cm and 145 cm). The class could use these results to plan their order for tee shirts.

In transitioning from Level A to Level B explorations, the class might seek an explanation for the two clusters in the dot plot. One possible explanation is that boys and girls may have different lengths for arm span, and the class might investigate the question: Is there a difference in the distributions of arm spans between boys and girls?

In transitioning from Level A to Level B comparative dotplots using the same horizontal scale are useful for making comparisons between two or more distributions. Comparative dot plots for the arm span data are given in Figure A6.

continued on next page

tistical problem solving process and the evolution of statistical concepts and statistical thinking. At level A, the question posed is restricted to the classroom with data

**Figure C2:** Dotplot showing simulated sampling distribution



Movable line is at 0.60



**Figure A6:** Comparative Dot Plots for Arm Spans (Boys versus Girls)

Based on these dotplots, there appear to be differences between the two distributions. The center for girls appears to be around 125 cm, higher than the center for boys, around 112 cm. Both groups appear to be reasonably symmetric and the ranges for both groups are similar (Range for Boys is 122-92 = 30; Range for Girls is 145 - 111 = 34). Children will often make comparison by dividing the data based on a single point. For example, at the point 120 cm (the approximate center of the aggregated data in Figure A5), only two boys are above 120 cm while eleven girls are above this point. Based on these data, it appears that third grade girls generally have longer arms than third grade boys.

At Level B the comparison between two or more distributions would be based on the Five-Number Summaries and the corresponding boxplots. The Five-Number Summary is a division of the ordered collected by taking a census of the classroom. The data is analyzed using a picture graph and tallies and then collectively with a frequency table and a frequency bar graph. The interpretation is focused on comparing individual to individual variability and individual to group variability within the context of the question posed. No generalizations are expected beyond the classroom.

Transitioning to level B, the question posed is explored beyond the classroom with a random selection process being considered for gathering the data. Using multiplicative and proportional reasoning, level B students are able to transition to pictographs, circle graphs (pie charts) and relative frequency tables and bar graphs for summarizing the data. The interpretation is focused on both comparing within group variability and between group variability. Students make use of comparative relative frequency tables, comparative bar graphs, conditional percentages, and segmented bar graphs. At level B, students begin to understand the scope of inference is based on the manner in which the data are collected.

Transitioning to level C, students are expected to ask questions that apply beyond their individual class and attempt to generalize to a larger group. Random selection is an expectation at level C, not simply a consid-

data into four groups with approximately 25% of the data in each group. The boxplot is a graphical display of the ranges of each of these four groups. The comparative boxplots for the data given in Figures A5 and A6 are shown in Figure B4.



**Figure B4:** Comparative Dot Plots for Arm Spans (Boys versus Girls)

Comparing boxplots requires proportional reasoning. In this example, our conclusions would be similar to those made when comparing dotplots.

Notice that in the boxplots, the median arm span for girls (124 cm) is larger than the median armspan for boys (113.5). If these two groups can be considered as random samples, then at Level C we might ask: Is the difference between the median arm span between boys and girls statistically significant? Using simulation, we could investigate how often this large a difference occurs simply due to random variation.

| Process Component  | Level A                                | Level B  | Level C  |  |
|--------------------|--|--|--|--|
| Formulate Question | Questions restricted to classroom      | Questions not restricted to classroom                | Questions seek generalization  |  |
| Collect Data       | Census of classroom                    | Non-Random Sample<br>Surveys                         | Sample design using random selection   |  |
|                    |  | Begin to discuss random selection                    |  |  |
| Analyze Data       | Display variability within<br>a group  | Quantify variability within a group                  | Measure variability within a group   |  |
|                    | Compare individual to individual       | Compare group to group<br>(between) variability in   | Measure variability between<br>groups  |  |
|                    | Compare individual to group            | displays<br>Acknowledge sampling                     | Compare group to group using displays and measures of vari-  |  |
|                    |  | error  | ability  |  |
|                    |  | Some quantification of association                   | Describe and quantify sampling<br>error based on a simulated<br>sampling distribution with<br>margin of error and p-values.<br>Understand sampling variabil-<br>ity. |  |
|                    |  |  | Quantification of association  |  |
| Interpret Results  | Do not look beyond the data            | Acknowledge that looking beyond the data is feasible | Look beyond the data in some contexts  |  |
|                    | No generalization beyond the classroom | Acknowledge that a sample may or may not             | Generalize from sample to population   |  |
|                    |  | be representative of larger population               | Interpret models for association   |  |
|                    |  | Basic interpretation of models for association       |  |  |

Table 1—Problem Solving Across Maturation Levels

eration when collecting data. Levels A and B focus on interpreting variability through descriptive statistics. At level C, through the use of simulation, students are transitioned to forming empirical sampling distributions and introduced to the concept of sampling variability. The foundation is formed for introducing the key inferential concept of a p-value.

Table 1 summarizes how these examples illustrate the statistical problem solving process across the three maturation levels.

#### Summary

A good deal of progress has been made in statistics education in recent years, but there is still plenty of room for improvement. State standards and assessments are all over the map and the descriptions for statistics and data analysis are often poorly structured. Textbooks and other teaching materials tend to be unfocused and often include errors (unless these materials have statistics educators as part of the writing team). It is hoped that this report will provide stakeholders such as writers of state standards, writers of assessment items, educators at teacher preparation programs, curriculum directors, and Pre K-12 teachers with guidance in developing standards and assessments in data analysis. The *Framework* has already made a positive impact in the state of Georgia with the current revisions of the Georgia state mathematical standards.

#### References

"A Curriculum Framework for Pre K-12 Statistics Education" (http://www.amstat.org/education/gaise/)

Christine Franklin is a faculty member in the Department of Statistics at the University of Georgia and Gary Kader is a faculty member in the Department of Mathematical Sciences at Appalachian State University. They are both actively involved in statistical education at grade levels K-16.



The *Statistics Teacher Network (STN)* is a free newsletter published by the ASA/NCTM Joint Committee on Curriculum in Statistics and Probability for Grades K-12. After having taken a few months off, *STN* is alive and well and in a new electronic format! Visit *STN* issue 72 at <u>www.amstat.org/education/stn</u>.

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