## AP STATISTICS

## UNIT 5 <br> Sampling Distributions

Remember to go to AP Classroom
to assign students the online
Personal Progress Check for
this unit.
Whether assigned as homework or
completed in class, the Personal
Progress Check provides each
student with immediate feedback
related to this unit's topics and skills.
Personal Progress Check 5
Multiple-choice: ~35 questions
Free-response: $\mathbf{2}$ questions

- Probability and Sampling
Distributions
= Investigative Task


# Sampling Distributions 

## BIG IDEA 1

Variation and
Distribution IVAR

- How likely is it to get a value this large just by chance?


## BIG IDEA 2

Patterns and Uncertainty UNC

- How can we anticipate patterns in the values of a statistic from one sample to another?


## Developing Understanding

This unit applies probabilistic reasoning to sampling, introducing students to sampling distributions of statistics they will use when performing inference in Units 6 and 7. Students should understand that sample statistics can be used to estimate corresponding population parameters and that measures of center (mean) and variability (standard deviation) for these sampling distributions can be determined directly from the population parameters when certain sampling criteria are met. For large enough samples from any population, these sampling distributions can be approximated by a normal distribution. Simulating sampling distributions helps students to understand how the values of statistics vary in repeated random sampling from populations with known parameters.

## Building Course Skills 3.B 3.C. 4.B

The probabilities associated with the normal distribution are what statisticians use to justify claims about populations they'll never be able to measure directly. Revisiting these properties early in Unit 5 will reinforce why sampling distributions allow statisticians to approximate parameters for the population of interest. Sketching, shading, and labeling a normal distribution aids in understanding the probability being calculated. Students should practice creating graphical representations, labeling the mean, and marking off values 1,2 , and 3 standard deviations from the mean.

Students often struggle to interpret parameters of probability distributions in context, simply describing features of the graph rather than explicitly connecting those features to the situation described in the problem. Teachers can remind students that context is about a variable ("tip amounts," for example), not just the units (dollars). It's also critical that students explicitly show that the appropriate conditions have been verified, and that they avoid using nonspecific language
like "it" in their interpretations. Using an error analysis strategy with sample responses can help familiarize students with these issues before they make similar mistakes.

## Preparing for the AP Exam

Responses on the AP Exam often uncover gaps in understanding of sampling distributions. Students must clearly communicate whether they are talking about the distribution of a population, a sample of values (heights, for example), or a sample statistic from repeated samples (mean heights, for example). Broad generalizations, such as "larger samples have less variability," leave the exam reader unsure of whether the student is referring to variability within a sample (for which the statement would be false) or a sampling distribution. The word "it" often introduces ambiguity to a response. Students frequently show confusion about what condition to check when asserting that the sampling distribution of a given statistic is approximately normal. Students should support normal probability calculations with a sketch or a calculation of a standardized score ( $z$-score), rather than relying on calculator syntax.

## UNIT AT A GLANCE

|  | Topic | Skills | Class Periods <br> ~10-12 CLASS PERIODS |
| :---: | :---: | :---: | :---: |
| $\frac{\bar{\alpha}}{\frac{\alpha}{y}}$ | 5.1 Introducing Statistics: Why Is My Sample Not Like Yours? | 1.A Identify the question to be answered or problem to be solved (not assessed). |  |
| $\begin{aligned} & \text { O} \\ & \frac{\dot{N}}{K} \end{aligned}$ | 5.2 The Normal Distribution, Revisited | 3.A Determine relative frequencies, proportions, or probabilities using simulation or calculations. <br> 3.G Describe probability distributions. |  |
| $\begin{aligned} & \text { 00 } \\ & 0 \\ & 0 \end{aligned}$ | 5.3 The Central Limit Theorem | 3.C Describe probability distributions. |  |
|  | 5.4 Biased and Unbiased Point Estimates | 4.B Interpret statistical calculations and findings to assign meaning or assess a claim. <br> 3.B Determine parameters for probability distributions. |  |
|  | 5.5 Sampling Distributions for Sample Proportions | 3.B Determine parameters for probability distributions. <br> 3.C. Describe probability distributions. <br> 4.B Interpret statistical calculations and findings to assign meaning or assess a claim. |  |
|  | 5.6 Sampling Distributions for Differences in Sample Proportions | 3.B Determine parameters for probability distributions. <br> 3.C. Describe probability distributions. <br> 4.B Interpret statistical calculations and findings to assign meaning or assess a claim. |  |
|  | 5.7 Sampling Distributions for Sample Means | 3.3 Determine parameters for probability distributions. <br> 3.C. Describe probability distributions. <br> 4.B Interpret statistical calculations and findings to assign meaning or assess a claim. |  |
|  | 5.8 Sampling Distributions for Differences in Sample Means | 3.B Determine parameters for probability distributions. <br> 3.C Describe probability distributions. <br> 4.B Interpret statistical calculations and findings to assign meaning or assess a claim. |  |

Go to AP Classroom to assign the Personal Progress Check for Unit 5.
Review the results in class to identify and address any student misunderstandings.

## SAMPLE INSTRUCTIONAL ACTIVITIES

The sample activities on this page are optional and are offered to provide possible ways to incorporate various instructional approaches into the classroom. They were developed in partnership with teachers from the AP community to share ways that they approach teaching some of the topics in this unit. Please refer to the Instructional Approaches section beginning on p. 207 for more examples of activities and strategies.

| Activity | Topic | Sample Activity |
| :---: | :---: | :---: |
| 1 | 5.2 | Think Aloud <br> Group students into pairs within a larger group of four. Have each student individually read 2014 FRQ 3 and think aloud with their partner, brainstorming ways to begin each part of the question. Each student then independently completes all parts. Have the pairs compare answers within their groups, improving their individual responses as necessary. Groups can then compare their responses with other groups. Finally, have students score their responses according to the rubric. |
| 2 | 5.3 | Use Manipulatives <br> From a large container of pennies, have each student take two random samples of size 5, two of size 10, and two of size 25, and record the dates on those pennies. Have students calculate the mean of the dates in each sample and then construct four "dotplots" on the floor: one using the pennies, one using nickels placed at the mean of the student's sample size 5 , one using dimes placed at the mean of the sample size 10, and one using quarters placed at the mean of the sample size 25. |
| 3 | $\begin{aligned} & 5.5 \\ & 5.7 \end{aligned}$ | Password-Style Games <br> Have partners sit facing opposite sides of the room. Display vocabulary terms from the unit on the classroom screen. Have the students facing the screen describe the terms to their partner who then tries to guess the terms described. After half of the terms have been used, have students switch roles. Terms to include: parameter, statistic, sampling distribution, distribution of sample data, sample distribution, unbiased estimator, sampling variability of a statistic, bias, sample proportion, sample mean, $\mu_{\hat{p}}, \sigma_{\hat{p}}, \mu_{\bar{x}}, \sigma_{\bar{x},}$, and central limit theorem. |



SKILL
8 Selecting Statistical Methods
1.A

Identify the question to be answered or problem to be solved.

## TOPIC 5.1

Introducing Statistics: Why Is My Sample Not Like Yours?

## Required Course Content

## ENDURING UNDERSTANDING

VAR-1
Given that variation may be random or not, conclusions are uncertain.

## LEARNING OBJECTIVE

VAR-1.G
Identify questions suggested by variation in statistics for samples collected from the same population. [Skill 1.A]

ESSENTIAL KNOWLEDGE

## VAR-1.G. 1

Variation in statistics for samples taken from the same population may be random or not.

TOPIC 5.2

## The Normal Distribution, Revisited

## Required Course Content

## ENDURING UNDERSTANDING

## VAR-6

The normal distribution may be used to model variation.

## LEARNING OBJECTIVE

## VAR-6.A

Calculate the probability that a particular value lies in a given interval of a normal distribution. [Skill 3.A]

## VAR-6.B

Determine the interval associated with a given area in a normal distribution. [Skill 3.A]

## ESSENTIAL KNOWLEDGE

## VAR-6.A. 1

A continuous random variable is a variable that can take on any value within a specified domain. Every interval within the domain has a probability associated with it.

## VAR-6.A. 2

A continuous random variable with a normal distribution is commonly used to describe populations. The distribution of a normal random variable can be described by a normal, or "bell-shaped," curve.

## VAR-6.A. 3

The area under a normal curve over a given interval represents the probability that a particular value lies in that interval.

## VAR-6.B. 1

The boundaries of an interval associated with a given area in a normal distribution can be determined using $z$-scores or technology, such as a calculator, a standard normal table, or computer-generated output.

## SKILLS

## 欲 Using Probability and Simulation

## 3.A

Determine relative frequencies, proportions, or probabilities using simulation or calculations.

## 3.G

Describe probability distributions.

## ILLUSTRATIVE EXAMPLE

Continuous random variable:
If one looks at a clock at a random time, the probability that the minute hand is between the 3 and the 6 is one fourth.

## LEARNING OBJECTIVE

## VAR-6.B

Determine the interval
associated with a given area
in a normal distribution.
[Skill 3.A]

## VAR-6.C

Determine the appropriateness of using the normal distribution to approximate probabilities for unknown distributions.
[Skill 3.C]

## ESSENTIAL KNOWLEDGE

## VAR-6.B. 2

Intervals associated with a given area in a normal distribution can be determined by assigning appropriate inequalities to the boundaries of the intervals:
a. $P\left(X<x_{a}\right)=\frac{p}{100}$ means that the lowest $p \%$ of values lie to the left of $x_{a}$.
b. $P\left(x_{a}<X<x_{b}\right)=\frac{p}{100}$ means that $p \%$ of values lie between $x_{a}$ and $x_{b}$.
c. $P\left(X>x_{b}\right)=\frac{p}{100}$ means that the highest $p \%$ of values lie to the right of $x_{b}$.
d. To determine the most extreme $p \%$ of values requires dividing the area associated with $p \%$ into two equal areas on either extreme of the distribution:
$P\left(X<x_{a}\right)=\frac{1}{2} \frac{p}{100}$ and $P\left(X>x_{b}\right)=\frac{1}{2} \frac{p}{100}$ means that half of the $p \%$ most extreme values lie to the left of $x_{a}$ and half of the $p \%$ most extreme values lie to the right of $x_{b}$.


## VAR-6.C. 1

Normal distributions are symmetrical and "bell-shaped." As a result, normal distributions can be used to approximate distributions with similar characteristics.

## TOPIC 5.3

## The Central Limit Theorem

## Required Course Content

## ENDURING UNDERSTANDING

## UNC-3

Probabilistic reasoning allows us to anticipate patterns in data.

## LEARNING OBJECTIVE

## UNC-3.H

Estimate sampling distributions using simulation. [Skill 3.C]

## ESSENTIAL KNOWLEDGE

## UNC-3.H. 1

A sampling distribution of a statistic is the distribution of values for the statistic for all possible samples of a given size from a given population.

## UNC-3.H. 2

The central limit theorem (CLT) states that when the sample size is sufficiently large, a sampling distribution of the mean of a random variable will be approximately normally distributed.

## UNC-3.H. 3

The central limit theorem requires that the sample values are independent of each other and that $n$ is sufficiently large.

## UNC-3.H. 4

A randomization distribution is a collection of statistics generated by simulation assuming known values for the parameters. For a randomized experiment, this means repeatedly randomly reallocating/reassigning the response values to treatment groups.

## UNC-3.H. 5

The sampling distribution of a statistic can be simulated by generating repeated random samples from a population.

## SKILL

## 各 Using Probability and Simulation

## 3.c

Describe probability distributions.


## SKILLS

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## 4.B

Interpret statistical calculations and findings to assign meaning or assess a claim.

## 8 Using Probability and Simulation

## 3.B

Determine parameters for probability distributions.

Biased and Unbiased Point Estimates

## Required Course Content

## ENDURING UNDERSTANDING

UNG-3
Probabilistic reasoning allows us to anticipate patterns in data.

## LEARNING OBJECTIVE

 UNC-3.IExplain why an estimator is or is not unbiased. [Skill 4.B]

## UNC-3.J

Calculate estimates for a population parameter.
[Skill 3.B]

## ESSENTIAL KNOWLEDGE

UNC-3.I. 1
When estimating a population parameter, an estimator is unbiased if, on average, the value of the estimator is equal to the population parameter.

## UNC-3.J. 1

When estimating a population parameter, an estimator exhibits variability that can be modeled using probability.

## UNC-3.J. 2

A sample statistic is a point estimator of the corresponding population parameter.

TOPIC 5.5
Sampling Distributions for Sample Proportions

## Required Course Content

## ENDURING UNDERSTANDING

UNC-3
Probabilistic reasoning allows us to anticipate patterns in data.

## LEARNING OBJECTIVE

## UNC-3.K

Determine parameters of a sampling distribution for sample proportions. [Skill 3.B]

## ESSENTIAL KNOWLEDGE

## UNC-3.K. 1

For independent samples (sampling with replacement) of a categorical variable from a population with population proportion, $p$, the sampling distribution of the sample proportion, $\hat{p}$, has a mean, $\mu_{\hat{p}}=p$ and a standard deviation,
$\sigma_{\hat{p}}=\sqrt{\frac{p(1-p)}{n}}$.

## UNC-3.K. 2

If sampling without replacement, the standard deviation of the sample proportion is smaller than what is given by the formula above. If the sample size is less than $10 \%$ of the population size, the difference is negligible.

## UNC-3.L. 1

For a categorical variable, the sampling distribution of the sample proportion, $\hat{p}$, will have an approximate normal distribution, provided the sample size is large enough: $n p \geq 10$ and $n(1-p) \geq 10$

## UNC-3.M. 1

Probabilities and parameters for a sampling distribution for a sample proportion should be interpreted using appropriate units and within the context of a specific population.

## SKILLS

## 各 Using Probability and Simulation

## 3.B

Determine parameters for probability distributions.

## 3.9

Describe probability distributions.
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## 4.B

Interpret statistical calculations and findings to assign meaning or assess a claim.


## AVAILABLE RESOURCES

- Classroom Resources >
- Sampling Distributions
- Calculations Aren't Enough! The Importance of Communication in AP Statistics


## UNC-3.L

Determine whether a sampling distribution for a sample proportion can be described as approximately normal.
[Skill 3.C]

## UNC-3.M

Interpret probabilities and parameters for a sampling distribution for a sample proportion. [Skill 4.B]



## SKILLS

领 Using Probability and Simulation

## 3.B

Determine parameters for probability distributions.

## $3 . \mathrm{c}$

Describe probability distributions.

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Argumentation

## 4.B

Interpret statistical calculations and findings to assign meaning or assess a claim.


AVAILABLE RESOURCES

- Classroom Resource >
- Sampling Distributions
- Calculations Aren't Enough! The Importance of Communication in AP Statistics

TOPIC 5.6
Sampling Distributions for Differences in Sample Proportions

## Required Course Content

## ENDURING UNDERSTANDING

## UNC-3

Probabilistic reasoning allows us to anticipate patterns in data.

## LEARNING OBJECTIVE

 UNC-3.NDetermine parameters of a sampling distribution for a difference in sample proportions. [Skill 3.B]

## ESSENTIAL KNOWLEDGE

## UNC-3.N. 1

For a categorical variable, when randomly sampling with replacement from two independent populations with population proportions $p_{1}$ and $p_{2}$, the sampling distribution of the difference in sample proportions $\hat{p}_{1}-\hat{p}_{2}$ has mean, $\mu_{\hat{p}_{1}-\hat{p}_{2}}=p_{1}-p_{2}$ and standard
deviation, $\sigma_{\hat{p}_{1}-\hat{p}_{2}}=\sqrt{\frac{p_{1}\left(1-p_{1}\right)}{n_{1}}+\frac{p_{2}\left(1-p_{2}\right)}{n_{2}}}$.

## UNC-3.N. 2

If sampling without replacement, the standard deviation of the difference in sample proportions is smaller than what is given by the formula above. If the sample sizes are less than $10 \%$ of the population sizes, the difference is negligible.



## SKILLS

领 Using Probability and Simulation

## 3.B

Determine parameters for probability distributions.

## 3.c

Describe probability distributions.
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## 4.B

Interpret statistical calculations and findings to assign meaning or assess a claim.

## available resources

- Classroom Resources>
- Sampling Distributions
- Calculations Aren't Enough! The Importance of Communication in AP Statistics


## Required Course Content

## ENDURING UNDERSTANDING

UNG-3
Probabilistic reasoning allows us to anticipate patterns in data.

## LEARNING OBJECTIVE UNC-3.Q <br> Determine parameters for a sampling distribution for sample means. [Skill 3.B]

## UNC-3.R

Determine whether a sampling distribution of a sample mean can be described as approximately normal.
[Skill 3.C]

## ESSENTIAL KNOWLEDGE

 UNC-3.Q. 1For a numerical variable, when random sampling with replacement from a population with mean $\mu$ and standard deviation, $\sigma$, the sampling distribution of the sample mean has mean $\mu_{\bar{x}}=\mu$ and standard deviation $\sigma_{\bar{x}}=\frac{\sigma}{\sqrt{n}}$.

## UNC-3.Q. 2

If sampling without replacement, the standard deviation of the sample mean is smaller than what is given by the formula above. If the sample size is less than $10 \%$ of the population size, the difference is negligible.

## UNC-3.R. 1

For a numerical variable, if the population distribution can be modeled with a normal distribution, the sampling distribution of the sample mean, $\bar{x}$, can be modeled with a normal distribution.

| Sampling Distributions |  |
| :--- | :--- |
|  |  |
| LEARNING OBJECTIVE | ESSENTIAL KNOWLEDGE |
| UNC-3.R | UNC-3.R.2 |
| Determine whether a sampling <br> distribution of a sample <br> mean can be described as <br> approximately normal. <br> [Skill 3.C] | For numerical variable, if the population <br> distribution cannot be modeled with a <br> normal distribution, the sampling distribution <br> of the sample mean, $\bar{x}$, can be modeled <br> approximately by a normal distribution, <br> provided the sample size is large enough, <br> e.g., greater than or equal to 30. |
| UNC-3.S | UNC-3.S. |
| Interpret probabilities <br> and parameters for a <br> sampling distribution for a <br> sample mean. [Skill 4.B] | Probabilities and parameters for a sampling <br> distribution for a sample mean should be <br> interpreted using appropriate units and within <br> the context of a specific population. |



## SKILLS

8 Using Probability and Simulation

## 3.B

Determine parameters for probability distributions.

## $3 . \mathrm{C}$

Describe probability distributions.

8 Statistical Argumentation

## 4.B

Interpret statistical calculations and findings to assign meaning or assess a claim.


## AVAILABLE RESOURCES

- Classroom Resources >
- Sampling Distributions
- Calculations Aren't Enough! The Importance of Communication in AP Statistics


## Required Course Content

## ENDURING UNDERSTANDING

## UNC-3

Probabilistic reasoning allows us to anticipate patterns in data.

## LEARNING OBJECTIVE UNC-3.T

Determine parameters of a sampling distribution for a difference in sample means. [Skill 3.B]

## ESSENTIAL KNOWLEDGE

## UNC-3.T. 1

For a numerical variable, when randomly sampling with replacement from two independent populations with population means $\mu_{1}$ and $\mu_{2}$ and population standard deviations $\sigma_{1}$ and $\sigma_{2}$, the sampling distribution of the difference in sample means $\bar{x}_{1}-\bar{x}_{2}$ has mean $\mu_{\left(\overline{x_{1}}-\overline{x_{2}}\right)}=\mu_{1}-\mu_{2}$ and standard deviation,
$\sigma_{\left(\bar{x}_{1}-\bar{x}_{2}\right)}=\sqrt{\frac{\sigma_{1}^{2}}{n_{1}}+\frac{\sigma_{2}^{2}}{n_{2}}}$.

## UNC-3.T. 2

If sampling without replacement, the standard deviation of the difference in sample means is smaller than what is given by the formula above. If the sample sizes are less than $10 \%$ of the population sizes, the difference is negligible.

QUICK REFERENCE FOR NOTATION AND
FORMULAS FOR SAMPLING DISTRIBUTIONS

| Distribution | Notes | Parameter(s) | Statistic | Conditions | Mean for Distribution | Standard Deviation for Distribution |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Normal distribution | A continuous random probability distribution | $\mu$ and $\sigma$ |  |  | $\mu$ | $\sigma$ |
| Sampling distribution for a sample proportion | Compare to the mean and standard deviation of a binomial random variable, $X$ | $p$ | $\hat{p}$ | - Simple random sample (Random) <br> - Normal or $n p \geq 10$ and $n(1-p) \geq 10$, (Large counts) <br> - For standard deviations: population $\geq 10 n$ ( $10 \%$ rule) | $\mu_{\hat{p}}=p$ | $\sigma_{\hat{p}}=\sqrt{\frac{p(1-p)}{n}}$ |
| Sampling distribution for a difference in sample proportions |  | $p_{1}-p_{2}$ | $\widehat{p}_{1}-\widehat{p}_{2}$ | - Simple random samples (Random) <br> - Large counts <br> - 10\% rule | $\mu_{\left(\hat{p}_{1}-\hat{p}_{2}\right)}=p_{1}-p_{2}$ | $\sigma_{\hat{p}_{1}-\hat{p}_{2}}=\sqrt{\frac{p_{1}\left(1-p_{1}\right)}{n_{1}}+\frac{p_{2}\left(1-p_{2}\right)}{n_{2}}}$ |
| Sampling distribution for the sample mean |  | $\mu$ | $\bar{x}$ | - SRS (Random) <br> - Normal or sample size $\geq 30$ <br> - $10 \%$ rule | $\mu_{\bar{x}}=\mu$ | $\sigma_{\bar{x}}=\frac{\sigma}{\sqrt{n}}$ |
| Sampling distribution for the difference in sample means |  | $\mu_{1}-\mu_{2}$ | $\overline{x_{1}}-\overline{x_{2}}$ | - SRS (Random) <br> - Normal or sample sizes $\geq 30$ <br> - $10 \%$ rule | $\mu_{\left(\overline{x_{1}}-\overline{x_{2}}\right)}=\mu_{1}-\mu_{2}$ | $\sigma_{\left(\overline{x_{1}}-\overline{x_{2}}\right)}=\sqrt{\frac{\sigma_{1}^{2}}{n_{1}}+\frac{\sigma_{2}^{2}}{n_{2}}}$ |
| Standard deviation |  | $\sigma$ | $s$ |  |  |  |

Note: Other notation could also be correct if properly defined. Incorrect notation will result in lost points on the AP exam.

