

Framework of Random Sampling

Nate Wells

Math 141, 3/1/22

Outline

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- Review Monday's group sampling activity
- Discuss the framework for random sampling
- Investigate properties of the sampling distribution

Section 1

Sampling Activity

Sampling Activity Discussion

- What is the theoretical mean value for the data set of card values?
- How does the distribution of sample means compare to the distribution of card values?
- What is the relationship between the centers of the two distributions?
- Which distribution appears to have more variability?
- How do the shapes of the two distributions compare?
- What does the variability of sample means suggest about the means in repeated samples?

Section 2

The Sampling Distribution

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 - Using theoretical tools, we can show that if the true proportion is $p = 0.002$, then the sampling distribution for $\hat{p}$ has mean 0.002 and standard error

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- That is, typically, a sample will have proportion $\hat{p} = 0.002$, and most samples will have proportion between 0.00 and 0.01.

Sampling Distribution vs. Population Distribution

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Sampling Distribution vs. Population Distribution

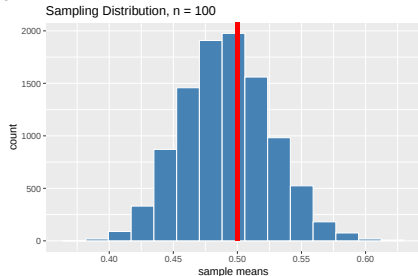
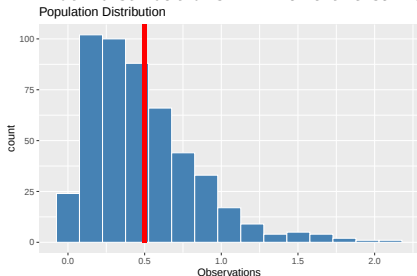
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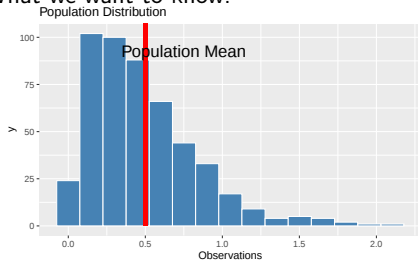
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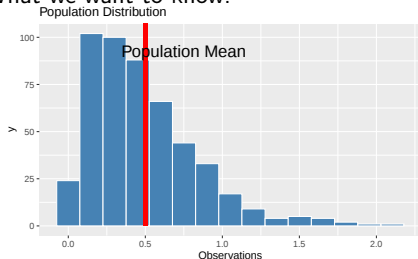
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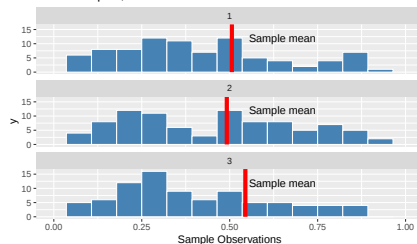
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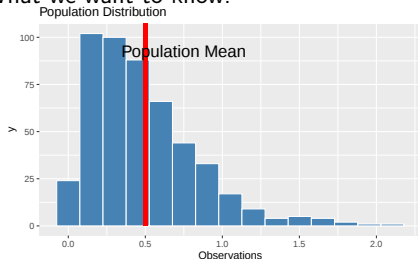
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Three samples, each of size $n = 100$



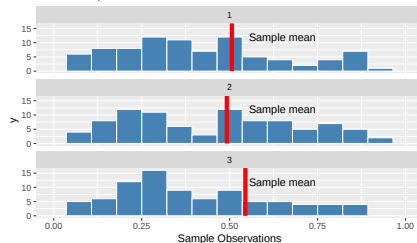
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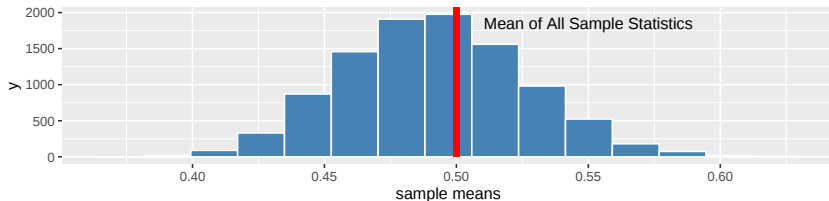
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What we know about what we have:

Sampling Distribution, $n = 100$



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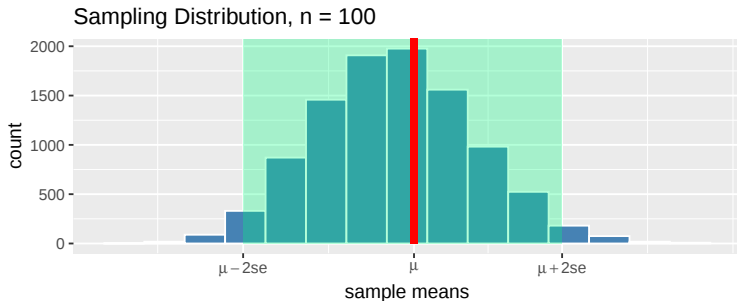
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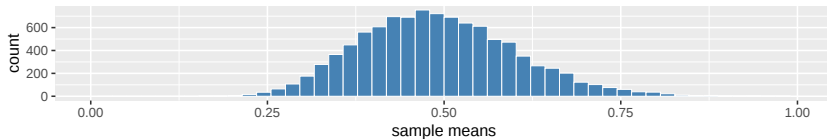
Standard Error and Sample Size

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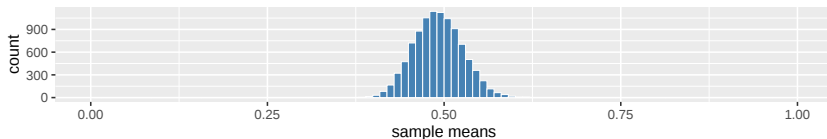
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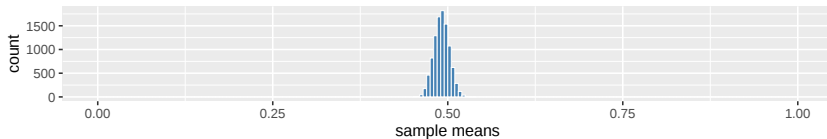
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Sampling Distribution, $n = 100$



Sampling Distribution, $n = 1000$



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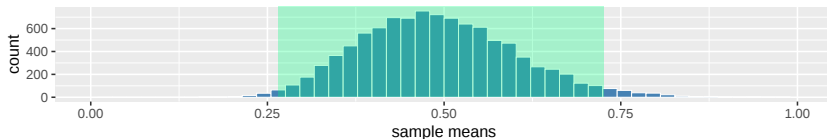
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n	mean	standard error	lower	upper
10	0.5	0.11	0.28	.72
100	0.5	0.035	0.43	0.57
1000	0.5	0.011	0.48	0.52

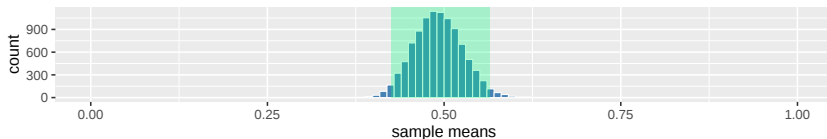
Variability and Sample Size III

- Highlighted in green are the intervals containing 95% of all sample means:

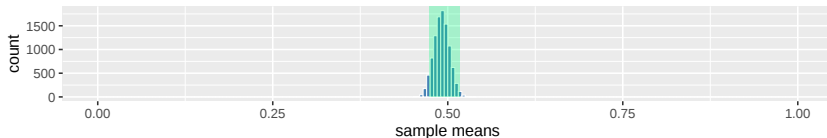
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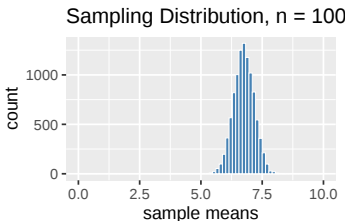
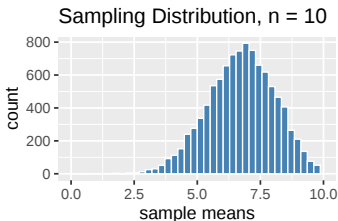
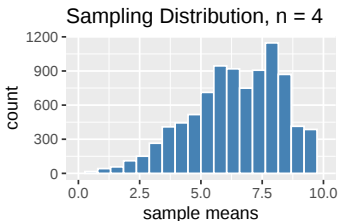
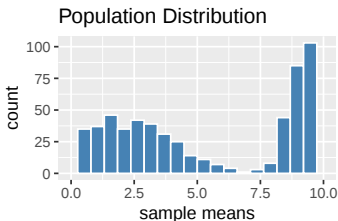


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 - The survey lists a margin of error of $\pm 3.8\%$, with 95% confidence (we'll discuss this next week)
- In the Nov. 3 2020 election, Biden/Harris had 50.01% of the vote, while Trump/Pence had 48.84% of the vote.

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- Is it **biased**? Yes. Although hopefully bias was reduced through use of survey weighting.