



**DATA 8**  
Fall 2016

# Lecture 23, October 19

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## Confidence Intervals

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# Announcements

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- Exams, solutions, score summary, and regrading policy have been released. See Gradescope and Piazza.
  - Labs meet as usual this week.
  - No homework due this week.
  - Homework will be assigned on Friday.
  - Later this week I will post a note about courses to take if you are interested in learning more about data science.
  - As yet there is no clear timetable for a Data Science major or minor. But we're working on it.
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# Variability of an Estimate

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- One sample  One estimate
  - But the random sample could have come out differently.
  - Then the estimate would have been different.
  - Main question:
    - **How different could the estimate have been?**
  - The variability of the estimate tells us something about how accurate the estimate is.
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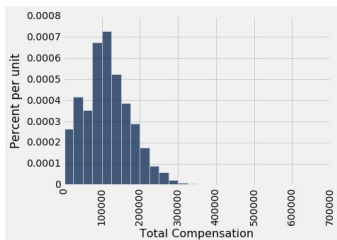
# The Bootstrap

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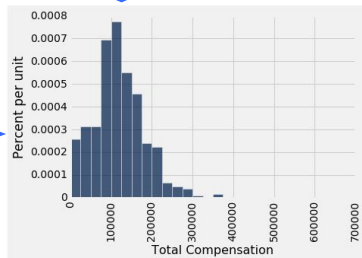
- Need another random sample that looks like the population
  - All that we have is the original sample
    - which is large and random.
    - It's a good bet that it resembles the population.
  - So **sample at random from the original sample!**
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# Why the Bootstrap Works

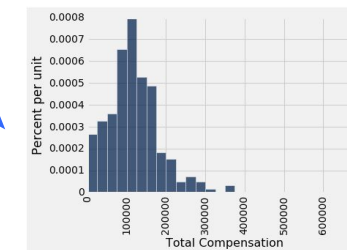
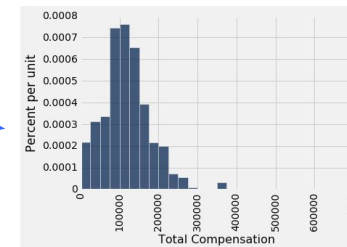
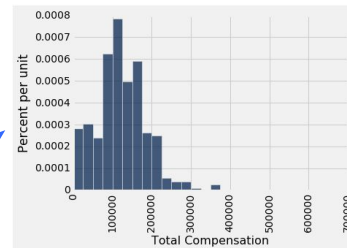
population



sample



resamples



All of these look pretty similar, most likely.

# Key to Resampling

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- From the original sample,
  - draw at random
  - **with** replacement
  - the **same number of times** as the original sample size.
- The size of the new sample has to be the same as the original one, so that the two estimates are comparable.

(Demo)

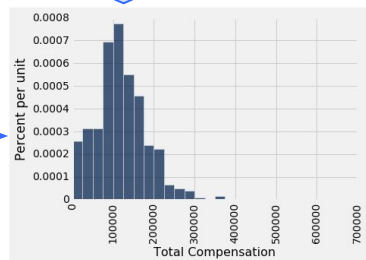
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# Inference Using the Bootstrap

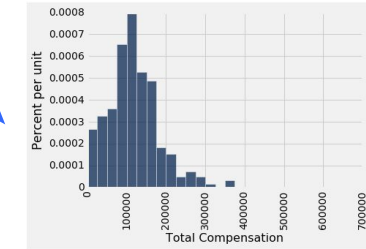
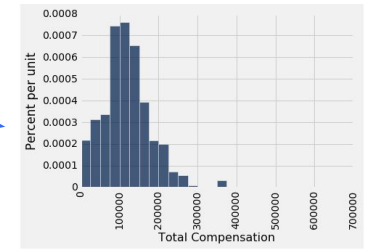
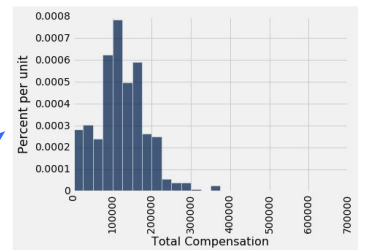
population



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# 95% Confidence Interval

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- Interval of **estimates of a parameter**
  - Based on random sampling
  - 95% is called the **confidence level**
    - Could be any percent between 0 and 100
    - Bigger is better
  - The **confidence is in the process** that generated the interval:
    - It generates a “good” interval about 95% of the time.
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# Bootstrap Percentile Method

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- For constructing a confidence interval for an unknown parameter
  - Starting point: one large random sample
  - One replication: (Demo)
    - Bootstrap the sample to get a “resample”
    - Get an estimate based on the resample
  - Repeat several thousand times (10,000 recommended)
  - For an approximate 80% confidence interval, take the 10th and 90th percentiles of all the bootstrap estimates
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