# Today's key words

- point estimate
- standard error
- sampling distribution

## **Point estimates**

- sample proportion
  - Each measurement is a 0 or 1.
  - 0 usually means "no" or "false" or "fail".
  - 1 usually means "yes" or "true" or "success".
  - The proportion is the average of the 0s and 1s.
- sample mean
  - Each measurement is a weight, height, mass, volume, count, etc...
  - The sample mean is the average of the measurements.

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Would you be surprised if you asked 12 more random BHCC students and 7 said yes?

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Based on all 24 students, what is the point estimate of the population proportion?

$$\frac{5+7}{24} = 0.5$$

Our point estimate is about 50% of BHCC students like coconut water.

Consider the probability distribution (infinite population) of rolling a fair 4-sided die.

| х    | 1    | 2    | 3    | 4    |
|------|------|------|------|------|
| P(x) | 0.25 | 0.25 | 0.25 | 0.25 |

What is the expected value when rolling a 4-sided die?

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What is the expected value when rolling a 4-sided die?

$$\mu = (1)(0.25) + (2)(0.25) + (3)(0.25) + (4)(0.25) = 2.5$$

Let's sample from this population.

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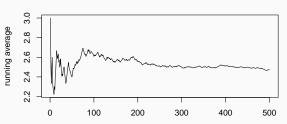
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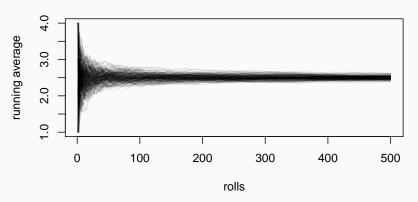
$$\mu = (1)(0.25) + (2)(0.25) + (3)(0.25) + (4)(0.25) = 2.5$$

Let's sample from this population.

The point estimate approaches the expected value.



## **Overlay of many Running Averages**

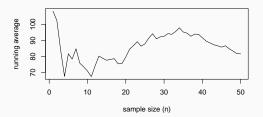


Notice the uncertainty gets smaller with larger sample size. However, there are diminishing returns...

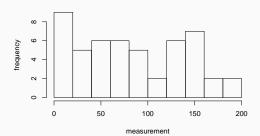
The accuracy improves drastically from n = 1 to n = 100, but not nearly as drastically from n = 401 to n = 500.

Now, imagine we sample from a new population/distribution, but we don't know the population parameters. What can we conclude?

#### How accurate is our point estimate?

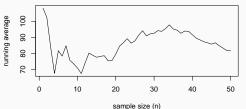


#### Histogram of sample from unknown population

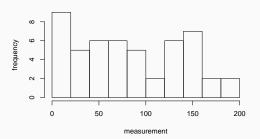


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# How accurate is our point estimate?



#### Histogram of sample from unknown population



Well, our point estimate is

$$\mu \approx \bar{x} = 81.5$$

However, we want to also describe our uncertainty. To me, based on the previous slide, I'd guess the uncertainty is about  $\pm 1/10$  of the range?

$$\mu = 81.5 \pm 20$$

## Standard error

Standard error quantifies our uncertainty of a point estimate.

$$SE = \frac{\sigma}{\sqrt{n}}$$

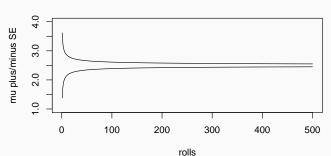
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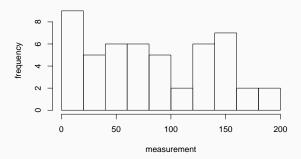
$$SE = \frac{\sigma}{\sqrt{n}}$$

Remember the 4-sided die. That distribution has  $\sigma = 1.118$ . We can plot  $\mu \pm SE$  as a function of n.

#### The standard error decreases with more rolls.

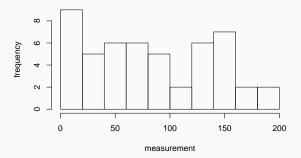


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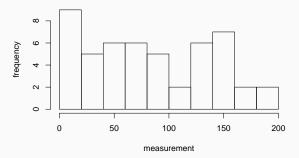
We do not know  $\sigma$ .

#### Histogram of sample from unknown population



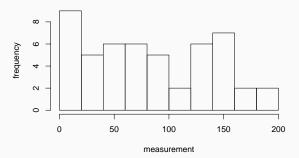
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#### Histogram of sample from unknown population



We do not know  $\sigma$ . We can estimate  $\sigma$  from s. I calculated s = 55.75.

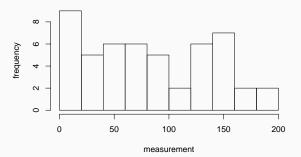
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$$SE \approx \frac{55.75}{\sqrt{50}} = 7.88$$

#### Histogram of sample from unknown population



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$$SE \approx \frac{55.75}{\sqrt{50}} = 7.88$$

So we think our estimate  $\mu \approx \bar{x} = 81.5$  has an "uncertainty" of 7.88. But we need to define SE better...

# **Sampling Distributions**

Let  $X_i$  be the *i*th draw from a population. Let n represent the number of draws. Let Y be the average of those draws.

$$Y = \frac{\sum_{i=1}^{n} X_i}{n}$$

By using the rules of Ch 2.4 we can show

$$\mu_Y = \mu_X$$

$$\sigma_Y = \frac{\sigma_X}{\sqrt{n}}$$

We say Y is determined by a sampling distribution. That sampling distribution has the same mean as the population, but it has a smaller standard deviation (and its SD shrinks as n increases). The SD of Y is the SE.

$$SE = \sigma_Y$$

# **Sampling Distributions**

Let  $X_i$  be the *i*th draw from a population. Let n represent the number of draws. Let  $\bar{X}$  be the average of those draws.

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By using the rules of Ch 2.4 we can show

$$E(\bar{X}) = E(X)$$

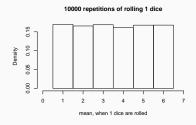
$$SD(\bar{X}) = \frac{SD(X)}{\sqrt{n}}$$

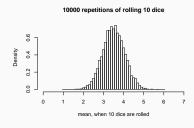
The book also uses  $SD_{\bar{x}}$  to represent standard error.

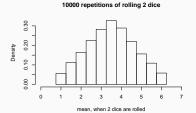
$$SE = SD(\bar{X}) = SD_{\bar{x}}$$

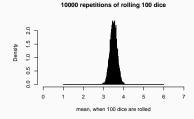
# **Sampling Simulations**

## Let's roll 6-sided dice (on a computer to save time).

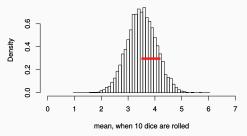






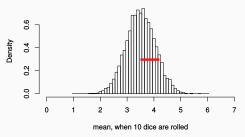


### 10000 repetitions of rolling 10 dice



Estimate the standard error when rolling 10 dice at a time.

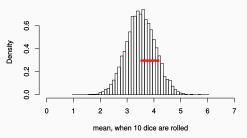
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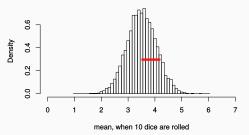


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I calculated that for rolling a single die,  $\sigma=1.71$ . Calculate the standard error when rolling 10 dice.

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I calculated that for rolling a single die,  $\sigma = 1.71$ . Calculate the standard error when rolling 10 dice.

$$SE = \frac{1.71}{\sqrt{10}} = 0.54$$