

# MM104/MM106/BM110

# Statistics and Data Presentation

## Lecture 5:

## Sampling distributions


## Distribution of the sample mean

Chris Robertson

# Central Limit Theorem

POPULATION!

- If  $x$  random with mean  $\mu$  and standard deviation  $\sigma$ , after random sampling with  $n$  measurements (*sample size*):

- If  $x$  normally distributed, sampling distribution of  $\bar{x}$  *exactly* normally distributed.
- If  $x$  non-normally distributed, sampling distribution of  $\bar{x}$  *approx.* normally distributed.  
 The larger the sample size, the closer to normality.

CENTRAL LIMIT  
THEOREM

# Central Limit Theorem

POPULATION!

- If  $x$  random with mean  $\mu$  and standard deviation  $\sigma$ , after random sampling with  $n$  measurements (*sample size*):

CENTRAL LIMIT  
THEOREM

- sampling distribution of  $\bar{X}$  has
- mean  $\mu$  and
- standard deviation  $\sigma/\sqrt{n}$ .

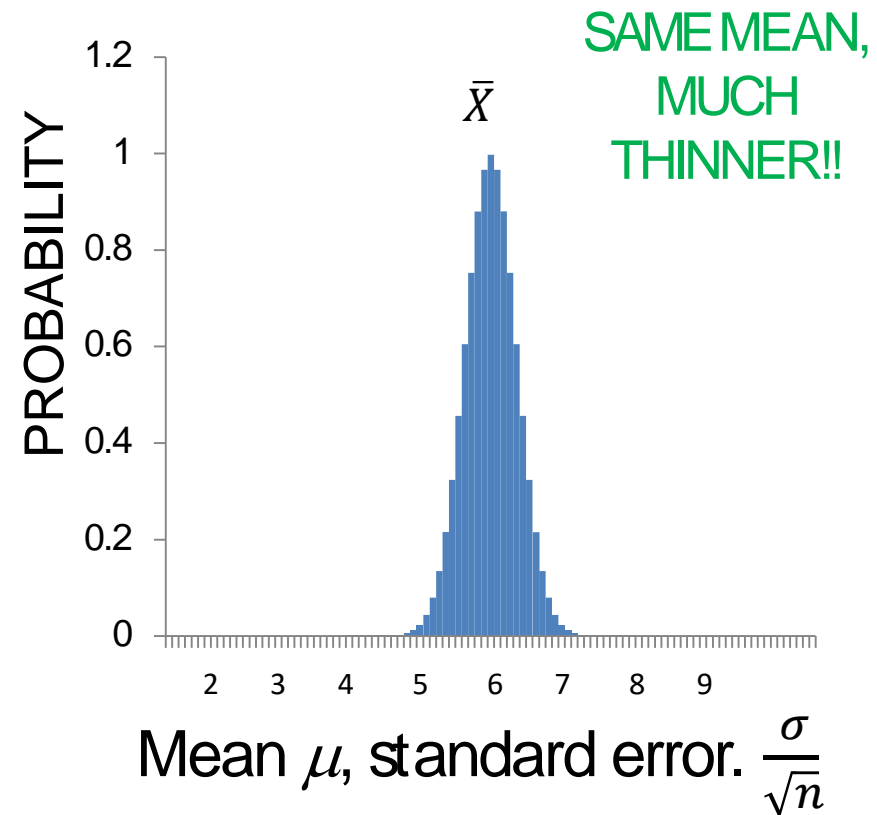
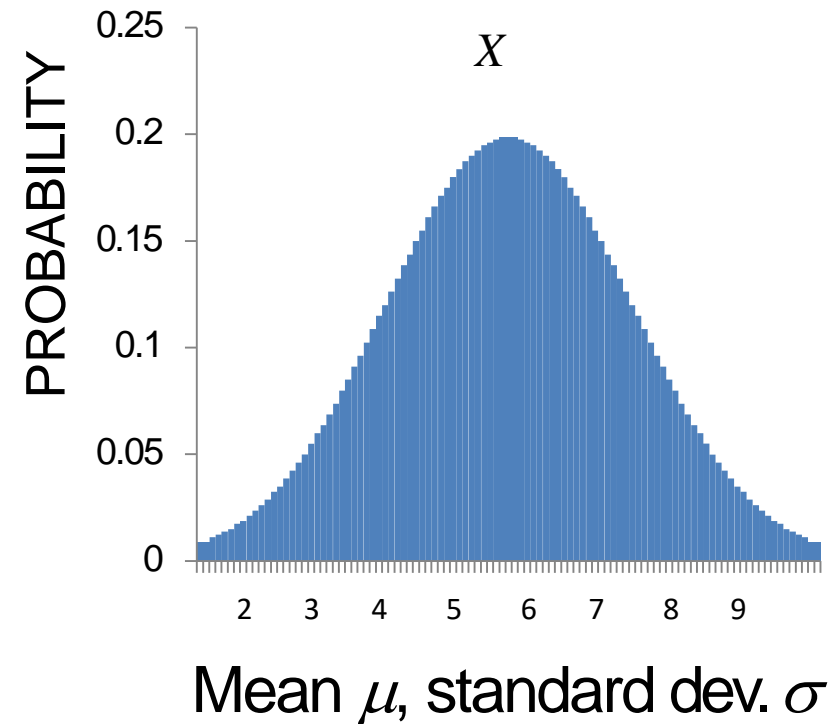
(STANDARD ERROR OF THE SAMPLE MEAN)

# Central Limit Theorem

- This is a very important mathematical result in Statistics
- It means that you can use a normal distribution to calculate probabilities associated with sampling distributions even if the original variable is not normally distributed
- We will use it to calculate probabilities about sample means even when the original variable is not normally distributed – such as the mean income when the distribution of income is skewed with a long tail to the right (high incomes)
- We will also use it to calculate probabilities about proportions which must lie between 0 and 1 and so cannot really be normally distributed.

# Original Distribution and Sampling distribution

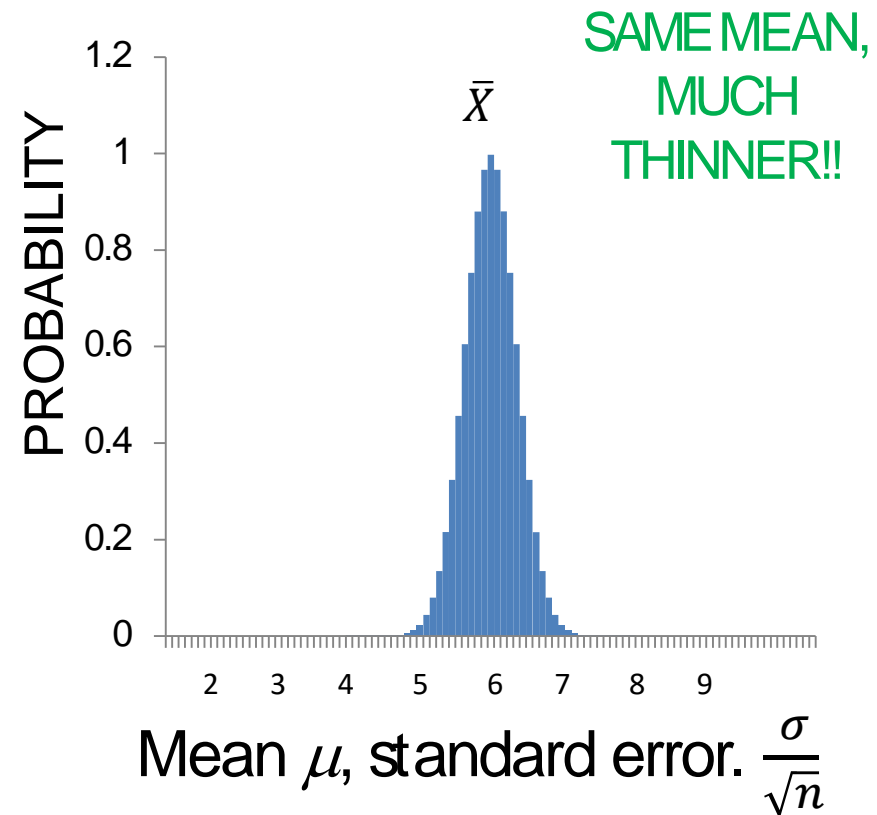
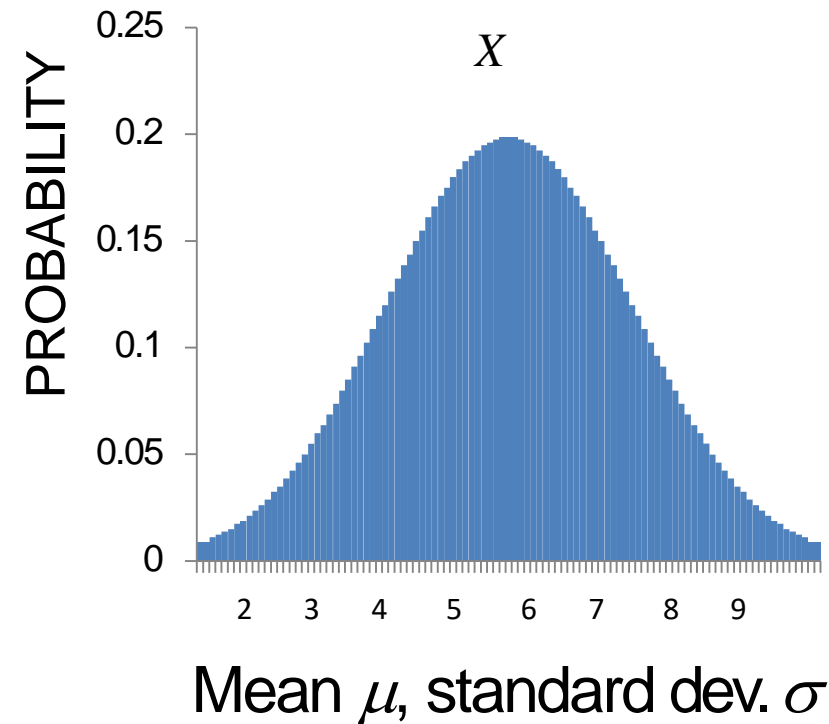
- Regardless of shape for  $x$ , in large samples the sampling mean distribution has mean  $\mu$  and standard error  $\sigma/\sqrt{n}$



# Original Distribution and Sampling distribution

Much thinner means that in the sampling distribution of the sample mean more of the probability is closer to the population mean  $\mu$  than in the distribution of  $X$

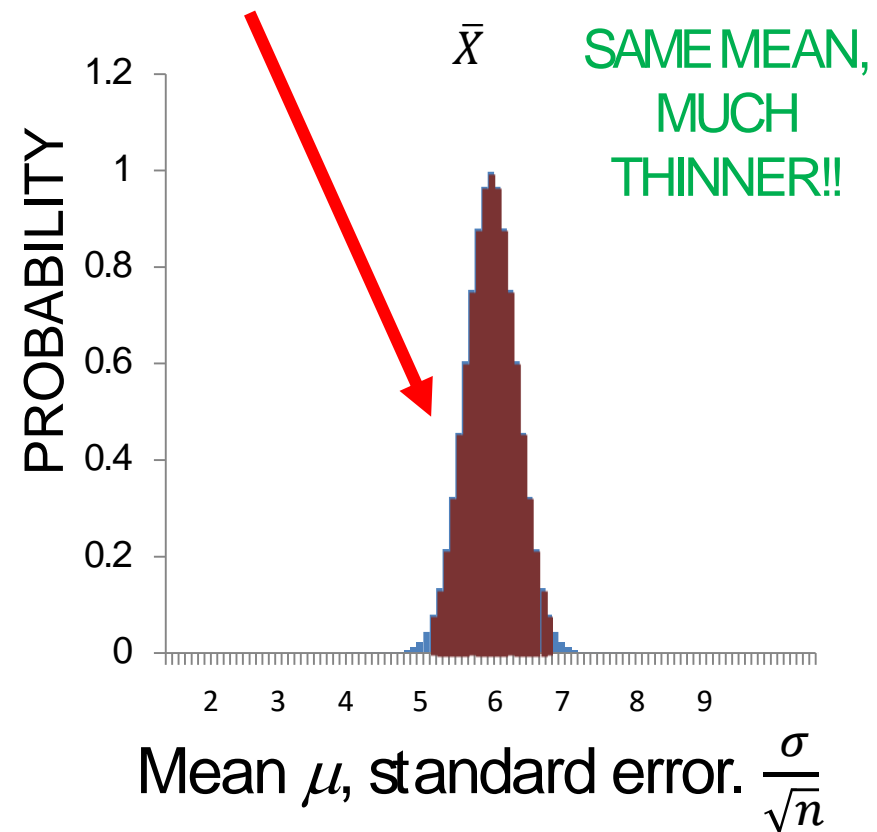
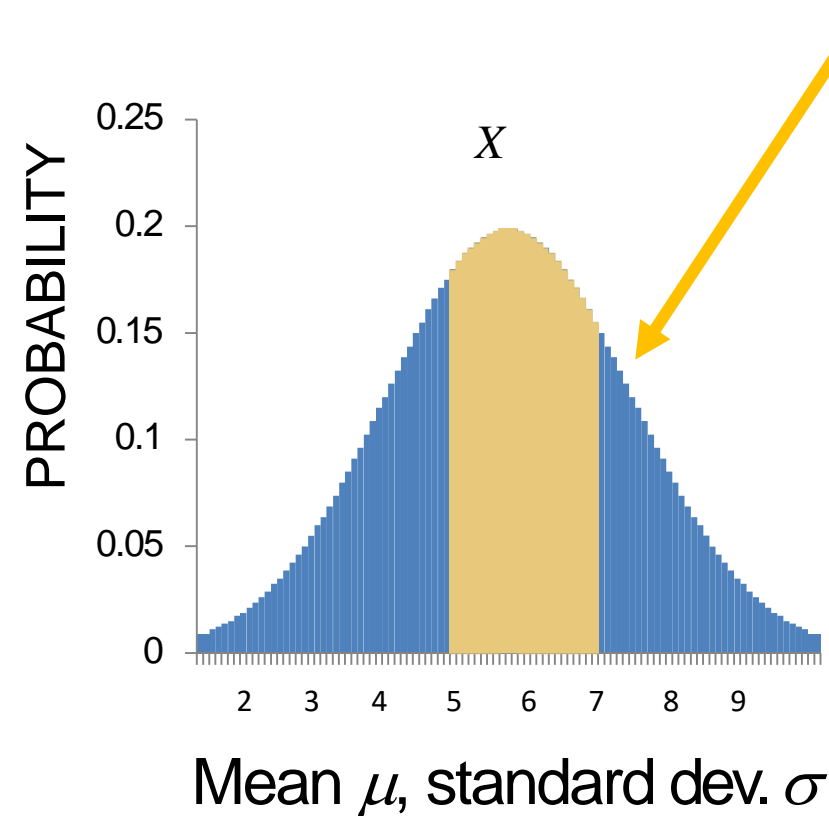
$$P(5 < X < 7) < P(5 < \bar{X} < 7)$$



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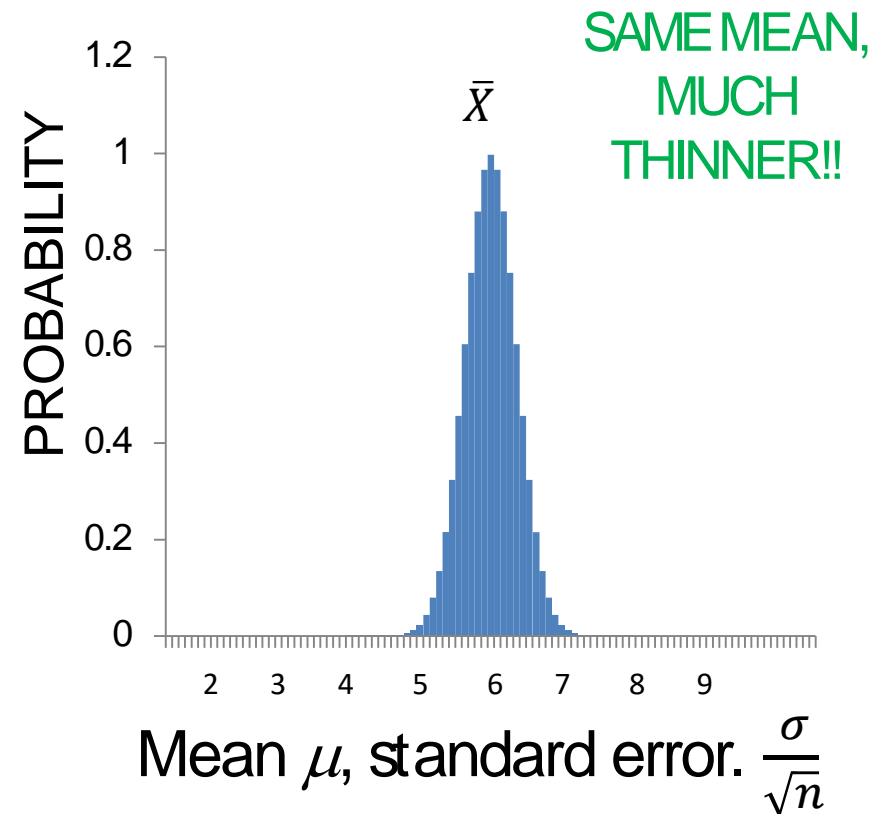
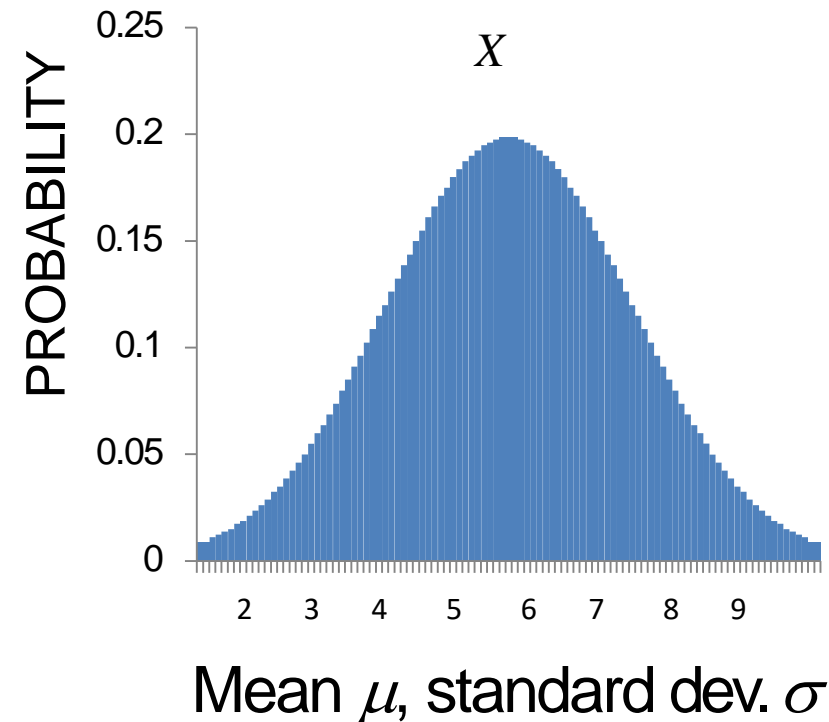
$$P(5 < X < 7) < P(5 < \bar{X} < 7)$$



# Original Distribution and Sampling distribution

It also means that the probability that the sample mean is far away from the population mean  $\mu$  is less than in than in the original distribution of  $x$

$$P(X > 7) > P(\bar{X} > 7)$$

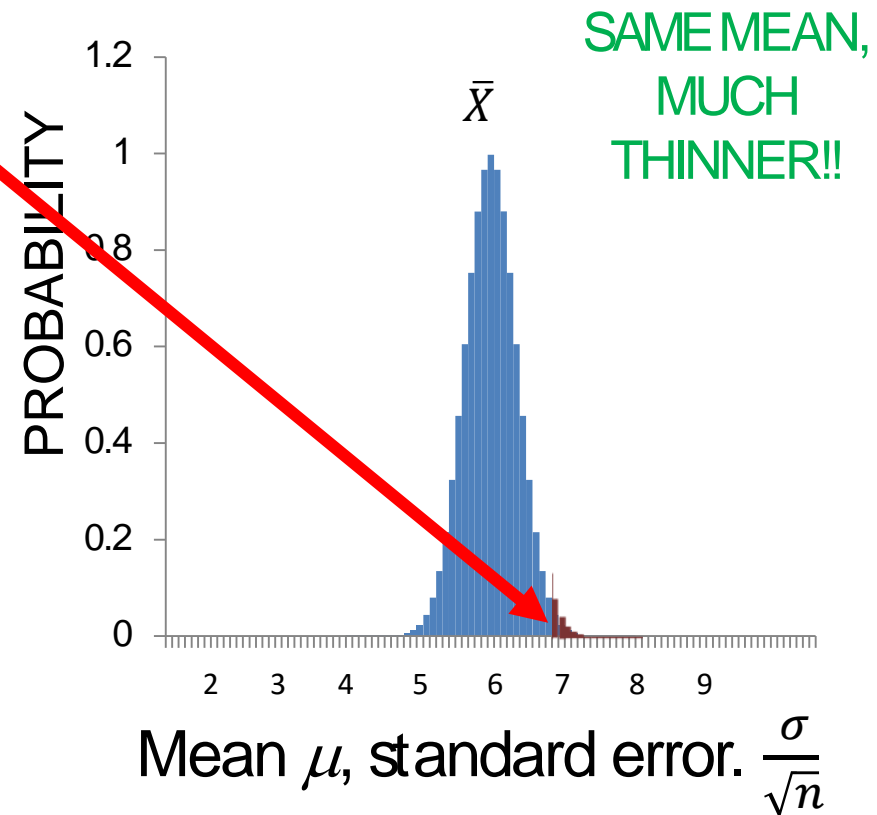
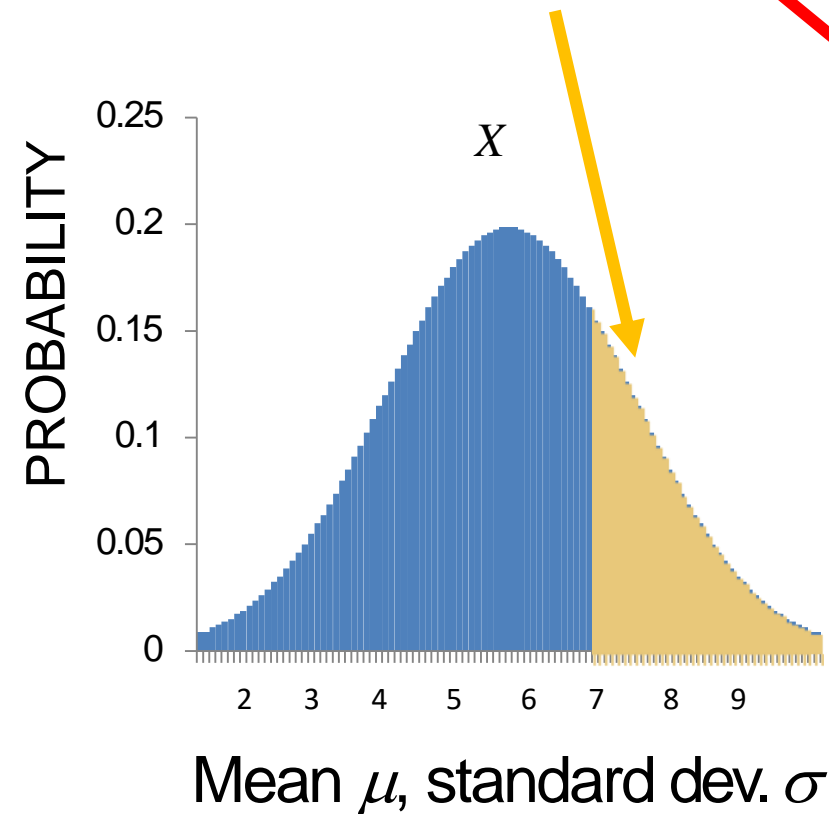




# Original Distribution and Sampling distribution

It also means that the probability that the sample mean is far away from the population mean  $\mu$  is less than in than in the original distribution of  $x$

$$P(X > 7) > P(\bar{X} > 7)$$



# Sampling distribution – probability calculation

- In a large company, the number of hours that full-time employees work in any week is known to be Normally distributed with  $\mu = 30\text{h}$  and standard deviation  $\sigma = 3.9\text{h}$ . An employee is paid overtime if she/he works more than 31.5 hours per week. What is the probability that a randomly selected employee will be paid overtime in any one week?

$x \equiv$  no. hours worked per week

$$P(x > 31.5)?$$

Use the tables of the normal distribution with a mean of 30 and standard deviation of 3.9

# Sampling distribution – probability calculation

$x \equiv$  no. hours worked per week

$$P(x > 31.5) = 0.35026$$

Use the tables of the normal distribution with a mean of 30 and standard deviation of 3.9

Normal t

**Tail**

☐ Lower

☒ Upper

☐ Both

**x**

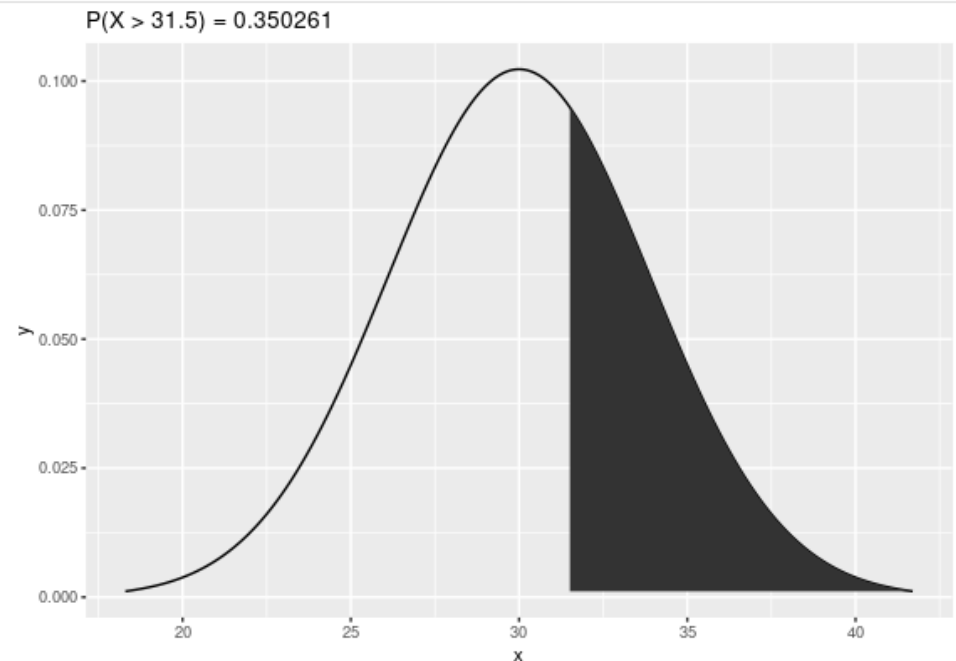
31.5

**Mean**

30

**sd**

3.9



Fill in the mean and standard deviation

# Sampling distribution – probability calculation

$x \equiv$  no. hours worked per week

$$P(x > 31.5) = 0.35026$$

Upper as  
probability is  
greater than x

Put the value of x in this box

Normal t

**Tail**

☐ Lower

☒ Upper

☐ Both

**x**

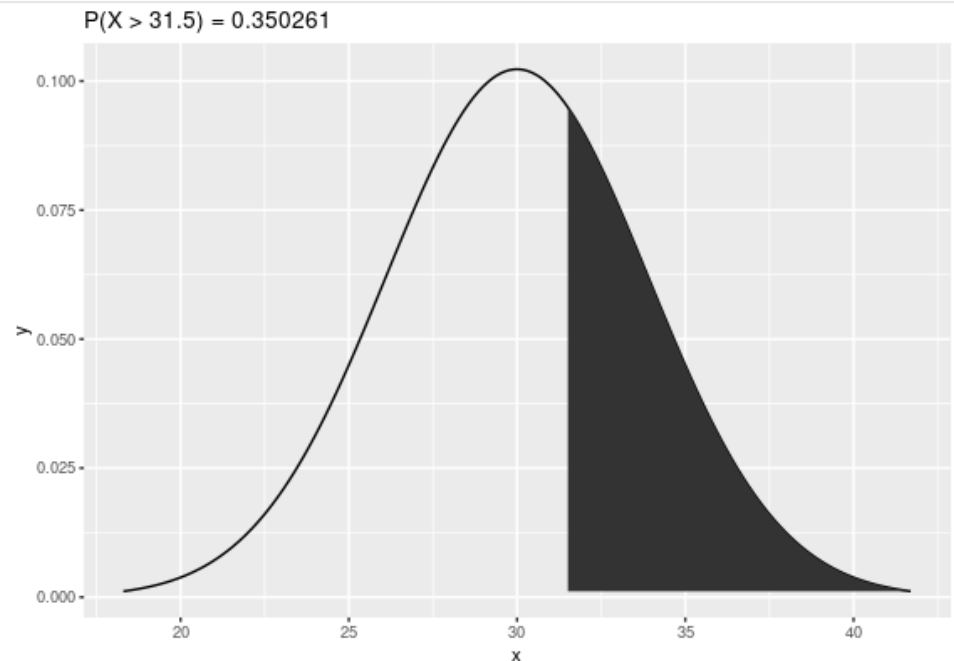
31.5

**Mean**

30

**sd**

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# Sampling distribution – probability calculation

$x \equiv$  no. hours worked per week

$$P(x > 31.5) = 0.35026$$

Use the tables of the normal distribution with a mean of 30 and standard deviation of 3.9

Normal t

**Tail**

☐ Lower

☒ Upper

☐ Both

**x**

31.5

**Mean**

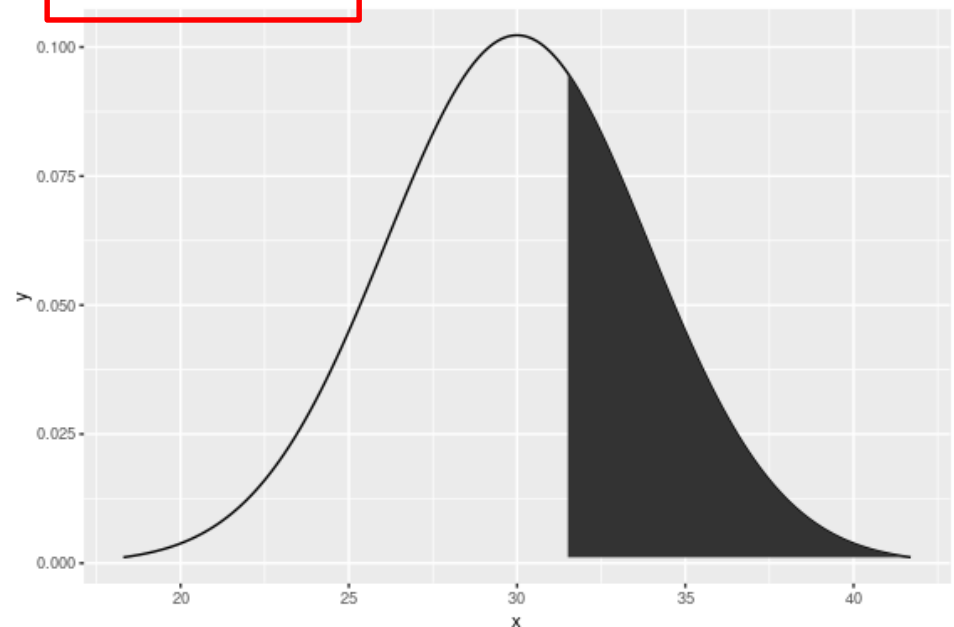
30

**sd**

3.9

Answer – always check with the graph that the area shaded is the one you think should be

$$P(X > 31.5) = 0.350261$$



# Sampling distribution – probability calculation

- Example:

- In a large company, the number of hours that full-time employees work in any week is known to be Normally distributed with  $\mu = 30\text{h}$  and standard deviation  $\sigma = 3.9\text{h}$ . What is the probability that the mean number of hours worked per week for 10 randomly selected employees is less than 31.5?

$n$

Mean number of hours,  $\bar{x}$ , is a random variable.

Its distribution is normal, with mean  $\mu = 30$  and standard error:

$$\frac{\sigma}{\sqrt{N}} = \frac{3.9}{\sqrt{10}} = 1.2333$$

$$P(\bar{X} < 31.5)$$

Use the tables of the normal distribution with a mean of 30 and standard deviation of 1.2333

# Sampling distribution – probability calculation

Mean number of hours,  $\bar{X}$ , is a random variable with a normal distribution.

mean  $\mu = 30$  and standard error:  $\frac{\sigma}{\sqrt{N}} = \frac{3.9}{\sqrt{10}} = 1.2333$

$$P(\bar{X} < 31.5) = 0.8881$$

Lower as  
probability is  
less than x

Use the  
tables of  
the normal  
distribution  
with a  
mean of 30  
and  
standard  
deviation of  
1.2333

Normal t

**Tail**

☒ Lower  
☐ Upper  
☐ Both

**x**

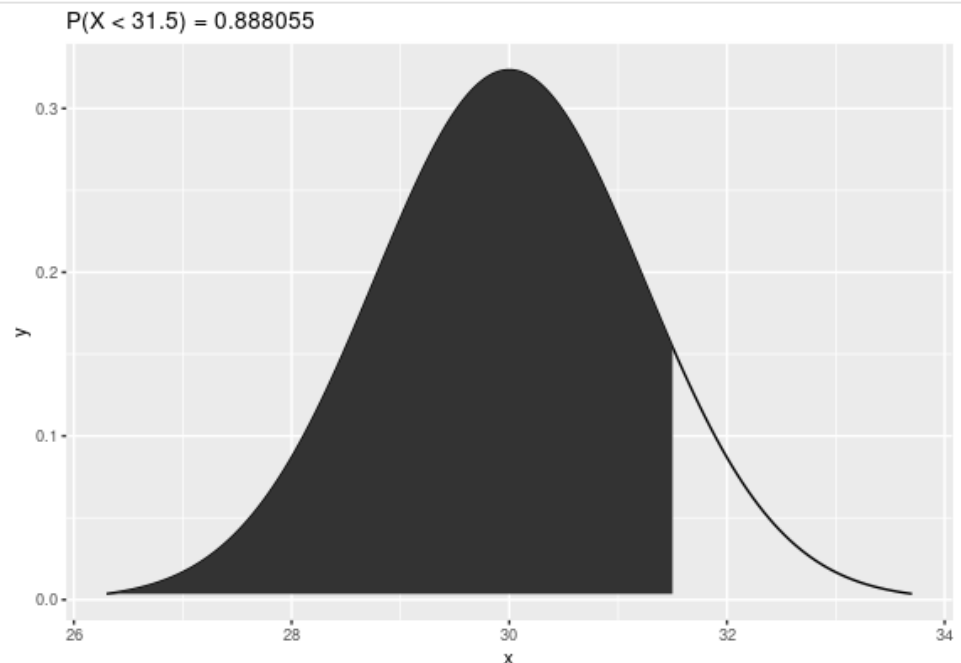
31.5

**Mean**

30

**sd**

1.2333



# Key Points

- The sampling distribution of the sample mean follows a normal distribution in large samples even if the original variable does not have a normal distribution
- The mean of the sampling distribution of the mean is the population mean

$$\mu_{\bar{X}} = \mu$$

- The standard deviation of the sampling distribution is known as the standard error of the sample mean

$$\sigma_{\bar{X}} = \frac{\sigma}{\sqrt{n}}$$

- If the original variable is normally distributed the distribution of the sample mean is normal irrespective of the sample size