

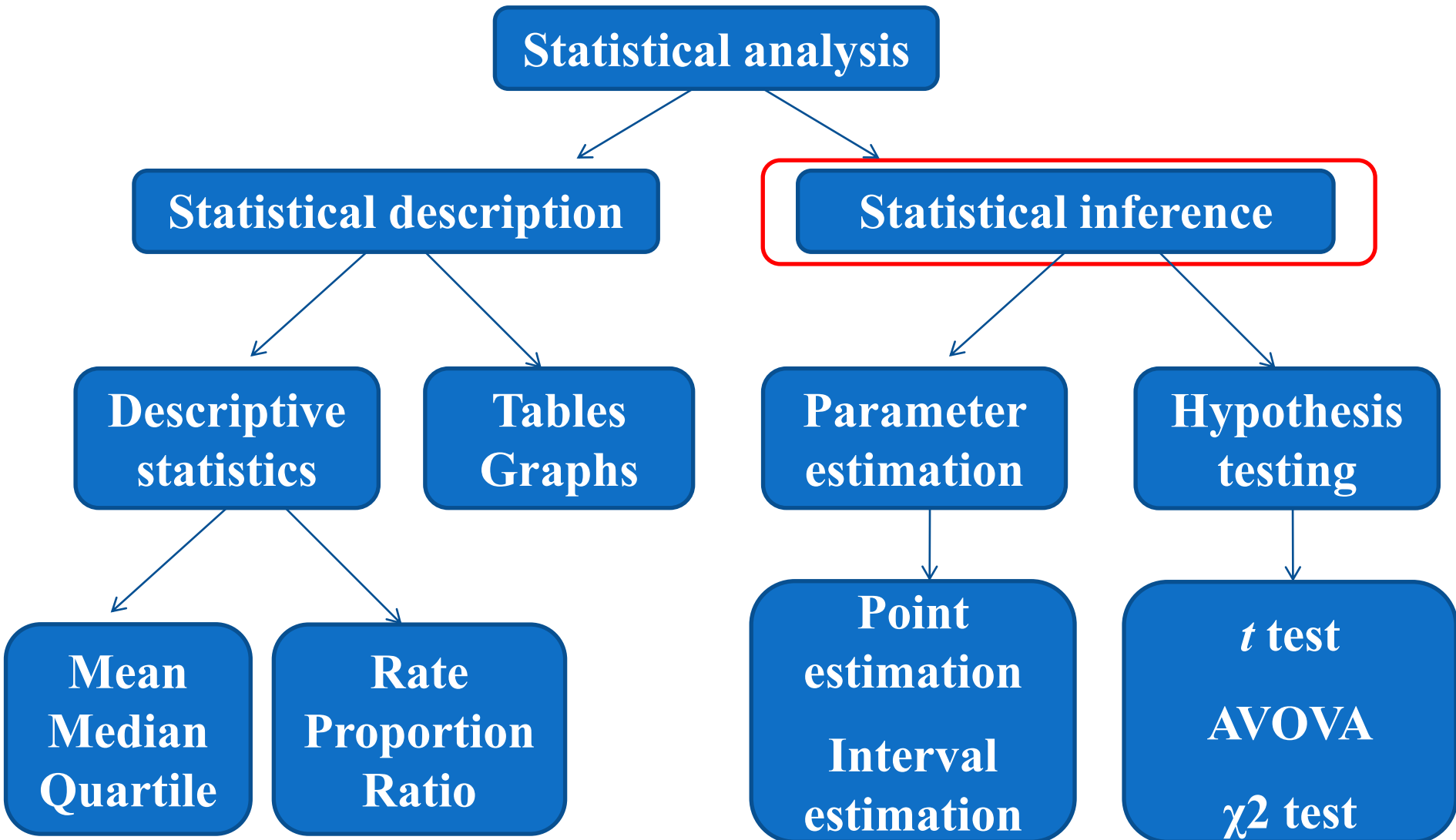
# Sampling error and t-distribution

養天地正氣  
法古今完人

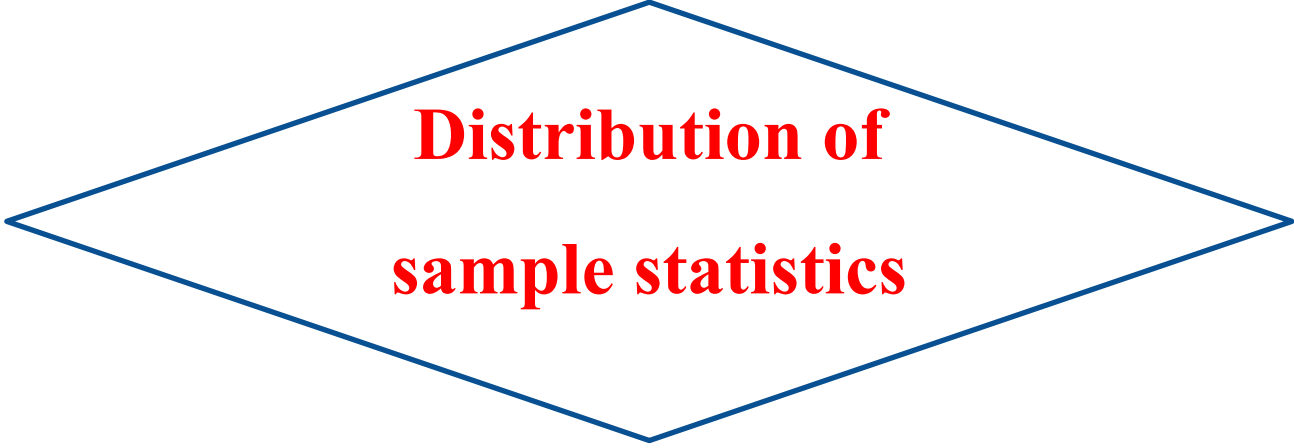
楊永清題



# Procedures of Statistical Analysis



# What is sampling distribution?



**Distribution of  
sample statistics**

# Main contents

1

- Sampling distribution of sample means (sampling error)

2

- Sampling distribution of sample rates

3

- $t$  distribution



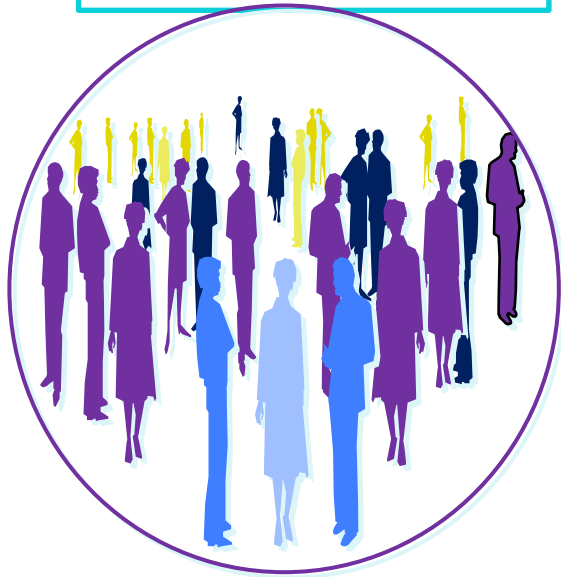
# **1. Sampling distribution of sample means**

# Sampling study

parameter?

$\mu$ ,  $\sigma$ ,  $\pi$

population



statistic

$\bar{x}$ ,  $s$ ,  $p$

sample

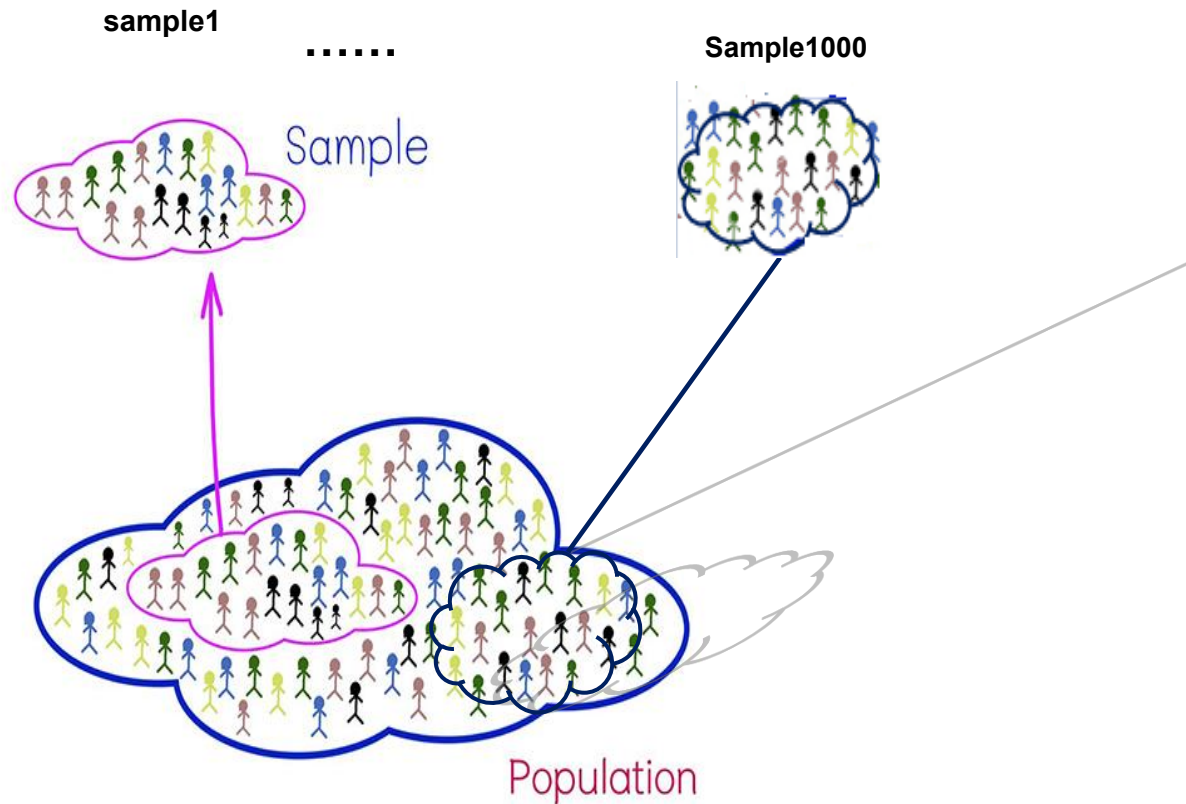


Randomly



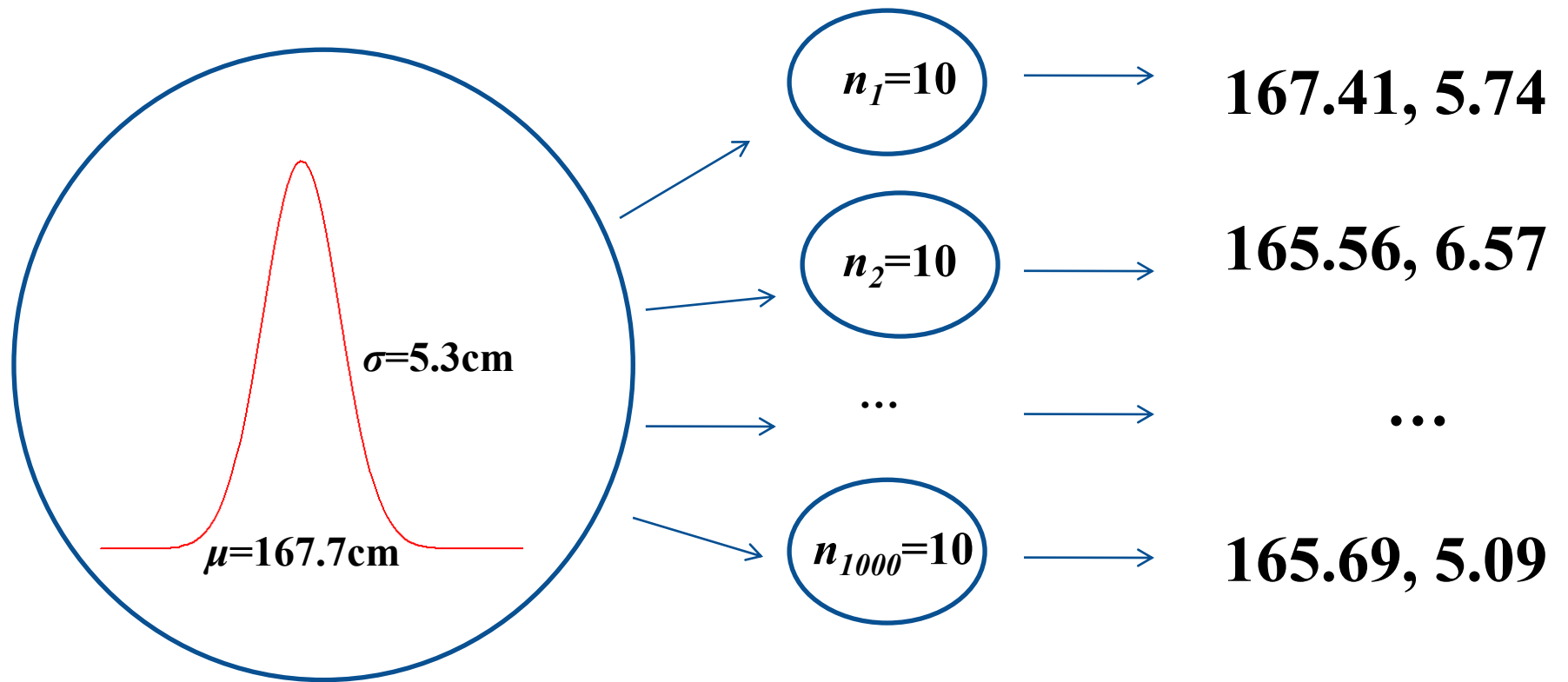
inference

# Sampling error



**Female height(cm):**  
 **$X \sim N(167, 5.3)$**

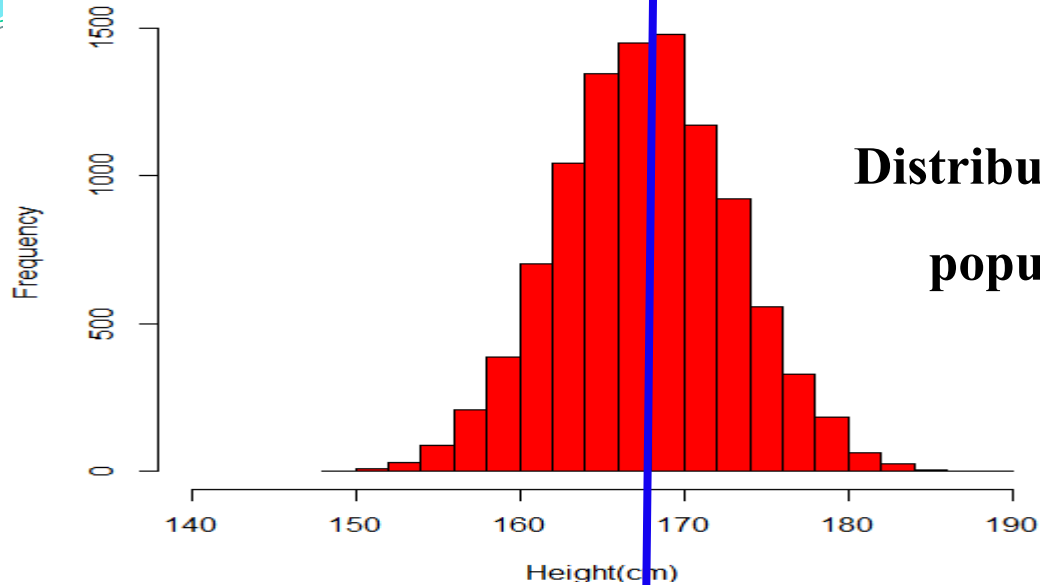
A sampling error occurs when the sample used in the study is not representative of the whole population.



$$\bar{x} = 167.5 \quad S_x = 1.67$$



Histogram of Heights



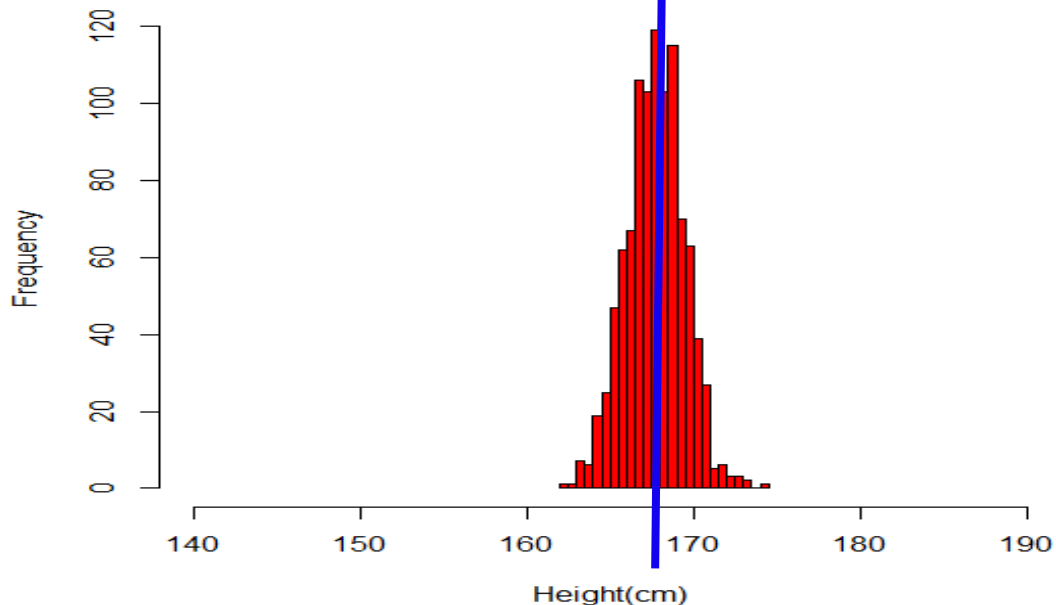
Distribution of observation values from the population with  $\mu=167.7\text{cm}$ ,  $\sigma=5.3\text{cm}$

Sampling error:

$$\overline{x_1} \neq \overline{x_2}$$

$$\bar{x} \neq \mu$$

Histogram of Heights



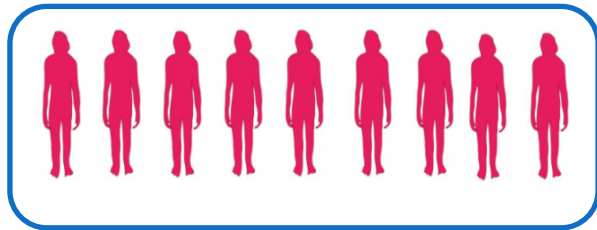
Distribution of sample means

## **Characteristics of the distribution of sample means:**

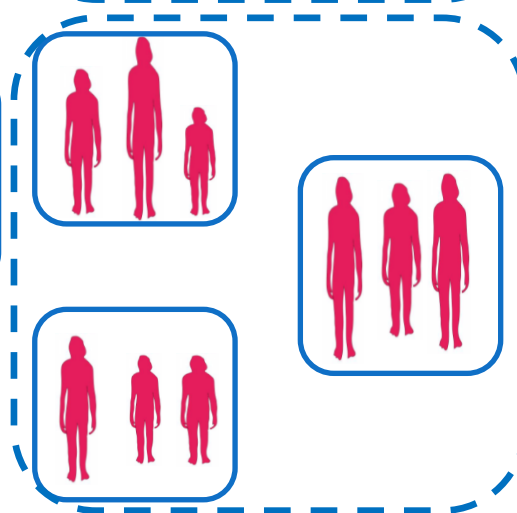
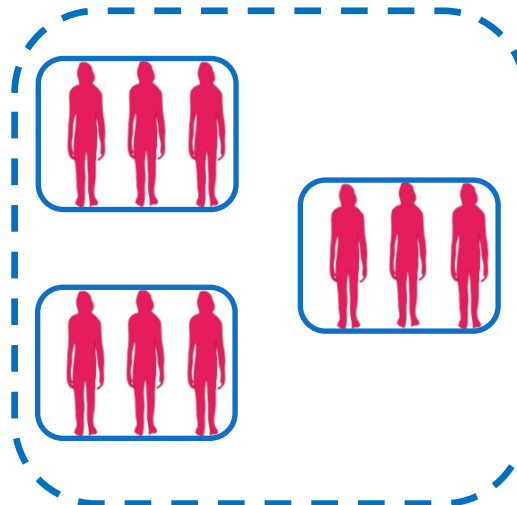
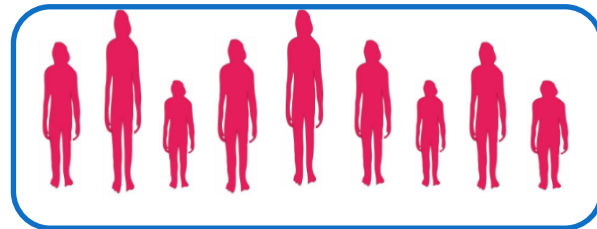
- ✓ **The sample mean does not necessarily equal the population mean  $\mu$  ;**
- ✓ **There are differences among sample means;**
- ✓ **The sample means are in the normal distribution;**
- ✓ **The mean of sample means is equal to  $\mu$ ;**
- ✓ **The deviation of sample mean is smaller than that of the original variable .**

# sampling error can't be deleted

Ideal population



Real population



① random  
selection

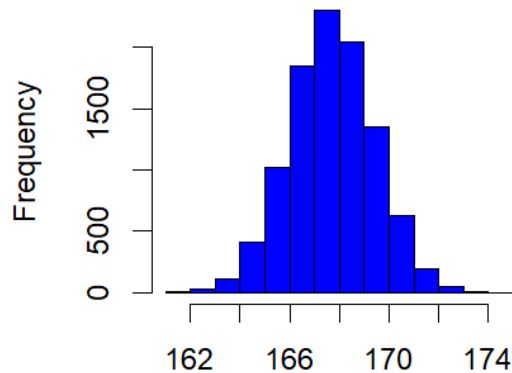


② variation

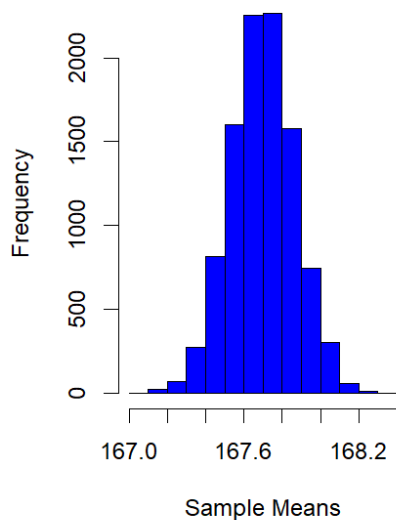
≡ Sampling error

# The rule of sampling error

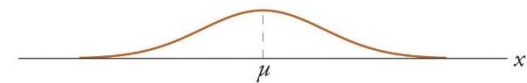
Sampling Distribution( $n=10$ )



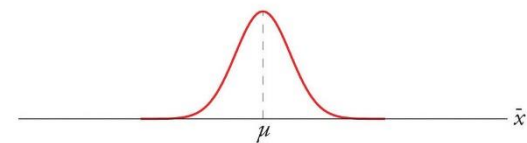
Sampling Distribution( $n=1000$ )



Population distribution



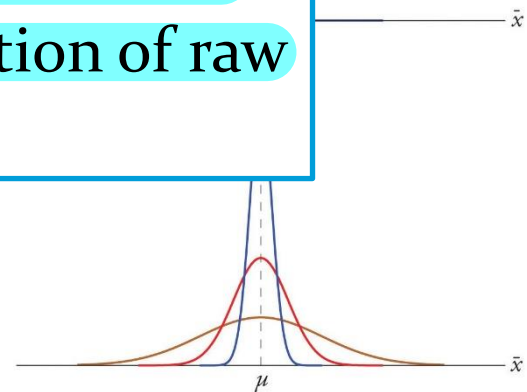
Sampling distribution of  $\bar{X}$  with  $n=5$



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

The distribution of sample means, is much narrower than the distribution of raw observations.

Distributions superimposed



# Prove

	Mean	Variance
Adding: $T = X + Y$	$\mu_T = \mu_X + \mu_Y$	$\sigma_T^2 = \sigma_X^2 + \sigma_Y^2$
Subtracting: $D = X - Y$	$\mu_D = \mu_X - \mu_Y$	$\sigma_D^2 = \sigma_X^2 + \sigma_Y^2$

$$\mu_{\bar{X}} = \frac{\mu_{(x_1 + x_2 + \dots + x_n)}}{n}$$

$$= \frac{1}{n} (\mu_{x_1} + \mu_{x_2} + \dots + \mu_{x_n}) = \frac{1}{n} (\mu + \mu + \dots + \mu) = \mu$$

# Prove

if  $X \sim N(\mu_1, \sigma_1^2)$   $Y \sim N(\mu_2, \sigma_2^2)$

$$\sigma_{\bar{x}}^2 = \sigma_{\frac{(x_1 + x_2 + \dots + x_n)}{n}}^2$$

$$= \left(\frac{1}{n}\right)^2 (\sigma_{x_1}^2 + \sigma_{x_2}^2 + \dots + \sigma_{x_n}^2)$$

$$= \left(\frac{1}{n}\right)^2 (\sigma^2 + \sigma^2 + \dots)$$

$$= \frac{\sigma^2}{n}$$

# Standard Error of mean (SEM)

For a random variable  $x (\mu, \sigma^2)$ , the mean of sample mean is still  $\mu$ , and the standard error of sample mean is

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

For a sample to estimate

$$s_{\bar{x}} = \frac{s}{\sqrt{n}}$$

## ***Question:***

**What are the differences between standard deviation and standard error of mean?**





# Differences between standard deviation and standard error of mean

- Standard error of mean reflects the variation of sample means and indicates the sampling error; standard deviation reflects the variation of individuals.
- The sign for standard error of mean is:  $\sigma_{\bar{X}}$ ,  $S_{\bar{X}}$  and the sign for standard deviation is  $\sigma$ ,  $S$ .
- Standard error of mean can be calculated by  $\sigma_{\bar{X}} = \frac{\sigma}{\sqrt{n}}$ ,  $S_{\bar{X}} = \frac{S}{\sqrt{n}}$
- Standard error of mean can be decreased by increasing the sample size, but standard deviation can not be controlled.

# Definition of Sampling Error

Due to the individual variations and random sampling, it results in:

- differences between sample statistics and population parameter;
- differences between sample statistic and sample statistic.

# Definition of Standard Error (SE)

**It is the standard deviation of sample statistics.**

- ✓ **Reflect the dispersion of sample statistics**
- ✓ **Reflect the magnitude of sampling error**

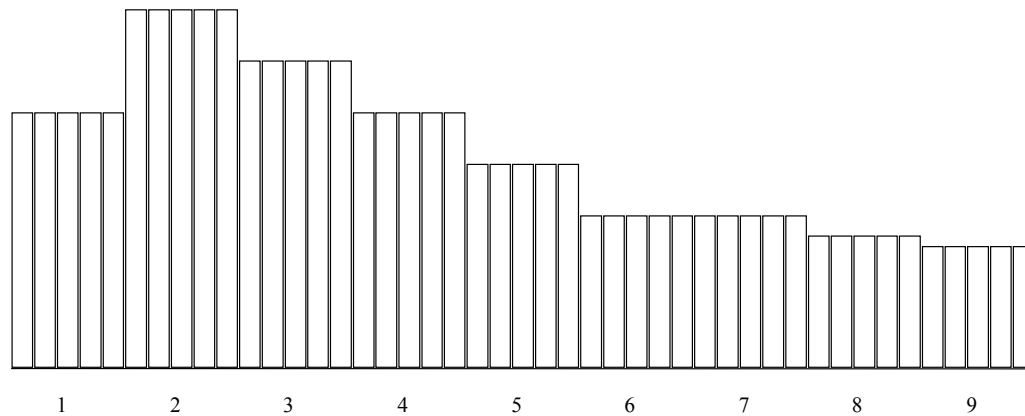
# Definition of Standard Error of Mean (SEM)

**It is the standard deviation of the sampling distribution of sample means.**

- ✓ Reflect the **dispersion of sample means**
- ✓ Reflect the **magnitude of sampling error**

$$\sigma_{\bar{x}} = \frac{\sigma}{\sqrt{n}} \quad s_{\bar{x}} = \frac{s}{\sqrt{n}}$$

# The population is not the normal distribution ?

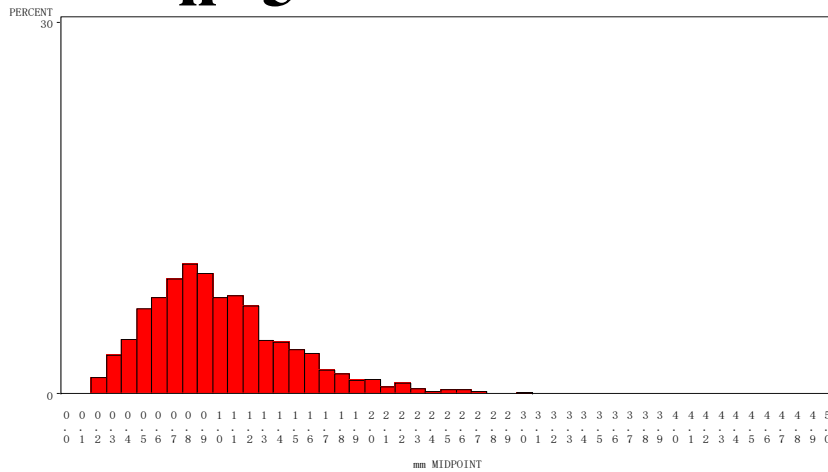


(a)

# Computer simulation results

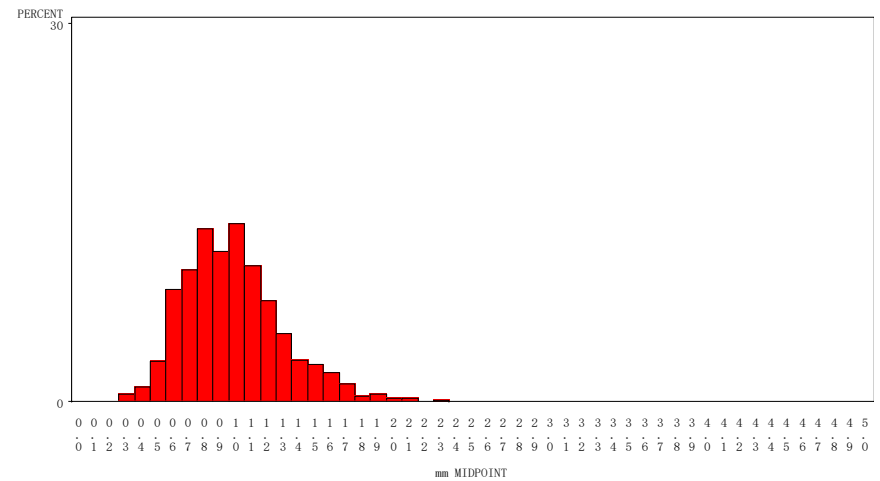
**n=5**

n=5



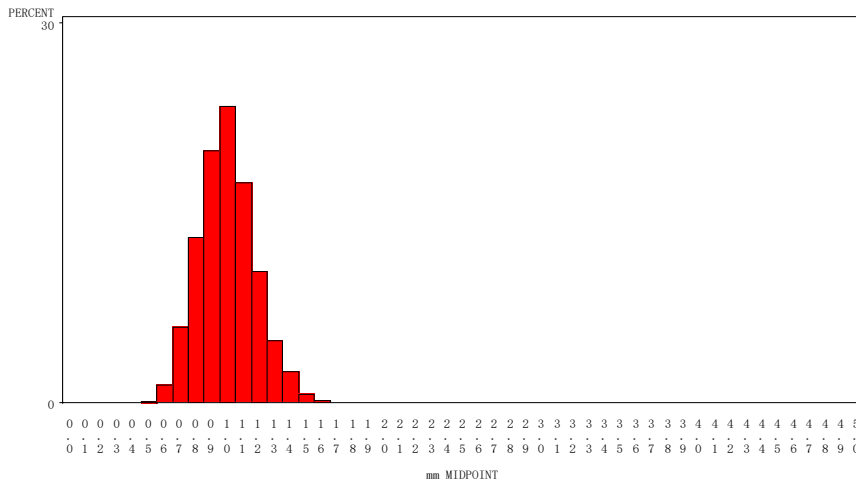
**n=10**

n=10



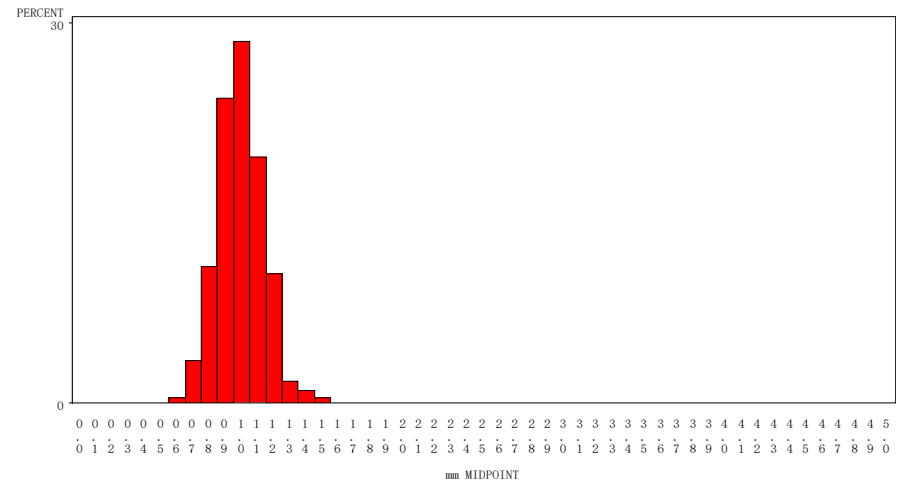
**n=30**

n=30



**n=50**

n=50



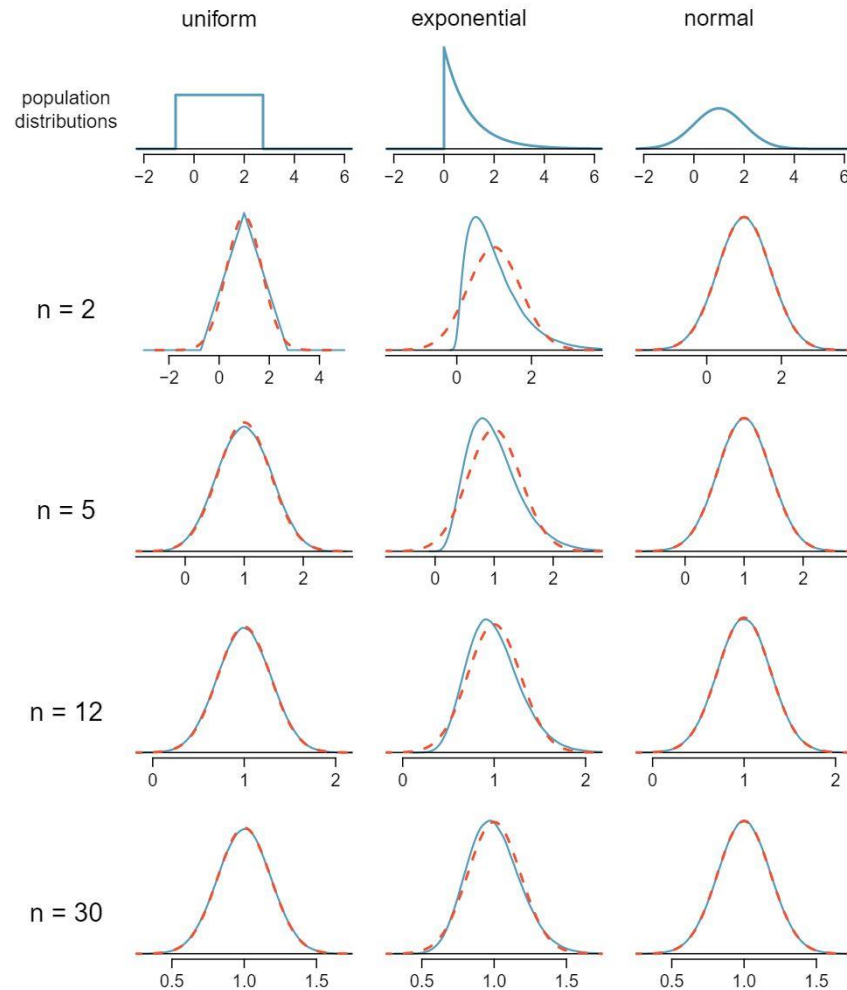
# Sampling distribution of sample means

1.  $\mu_{\bar{X}} = \mu_X$

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

3. *If  $X$  is normal,  $\bar{X}$  is normal. If  $X$  is nonnormal,  $\bar{X}$  is approximately normally distributed for sufficiently large sample size.*

# Central Limit Theorem



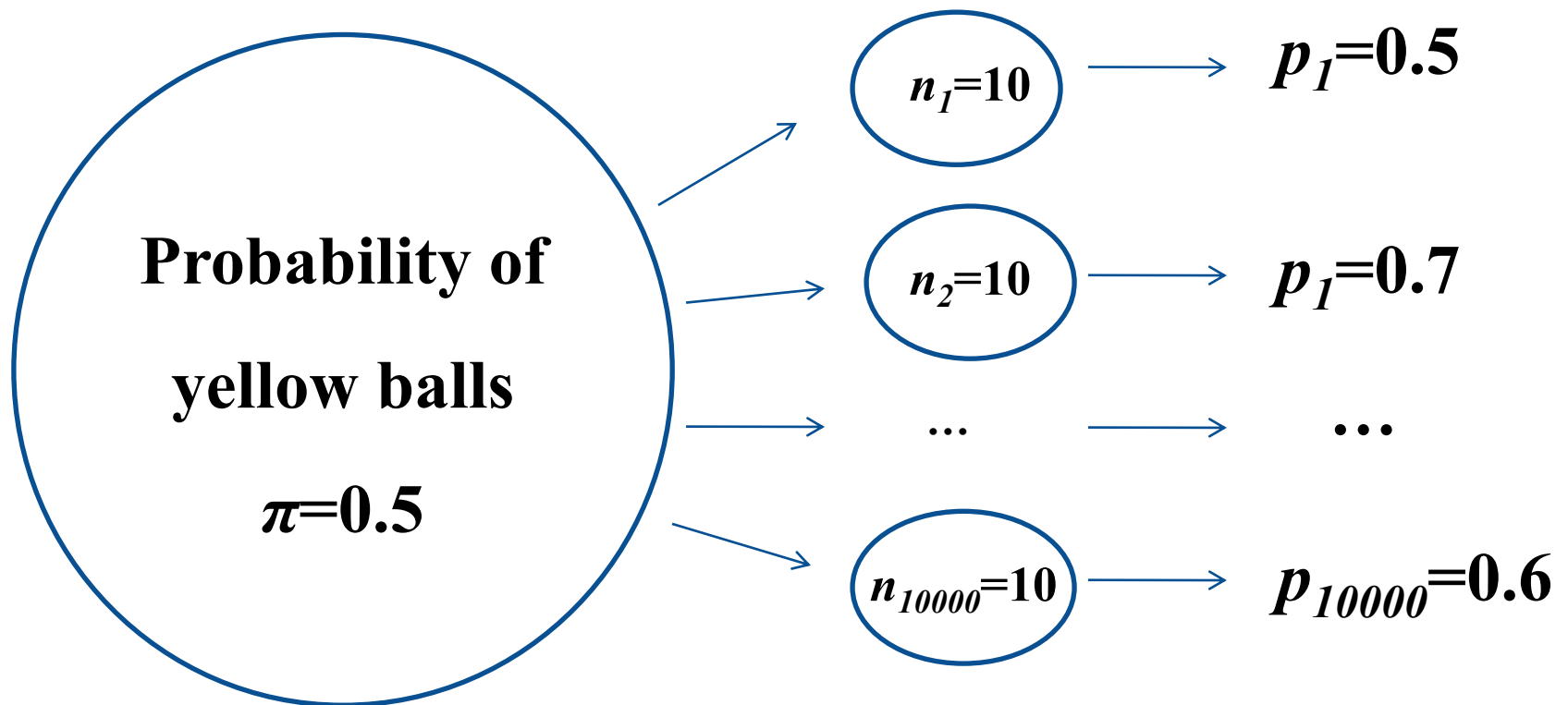
$n$  is large enough  
 $n > 30$

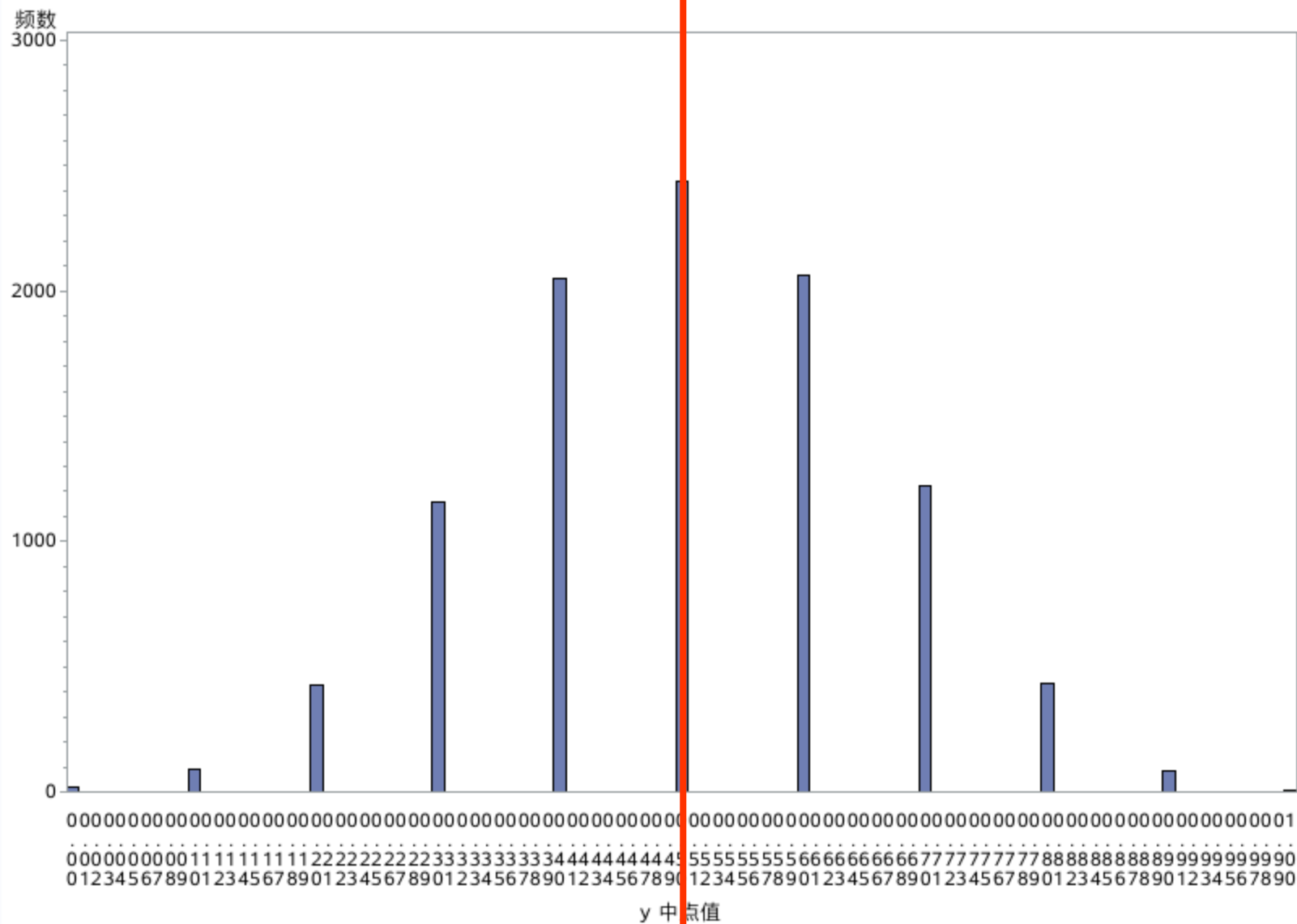




## **2. Sampling distribution of sample rates**

## Example 2





# *Sampling distribution of sample rates*

- ✓ The mean of sample rates is equal to the population rate:

$$\mu_p = \pi$$

- ✓ The population standard deviation of sample rates (namely **SER**) is:

$$\sigma_p = \sqrt{\frac{\pi(1-\pi)}{n}}$$

- ✓ In practice, the population rate is unknown, so the sample rate is often used instead:

$$S_p = \sqrt{\frac{p(1-p)}{n}}$$

# **Definition of Standard Error of Rate (SER)**

**It is the standard deviation of the sampling distribution of sample rates.**

- ✓ Reflect the dispersion of sample rates**
- ✓ Reflect the sampling error of sample rates**

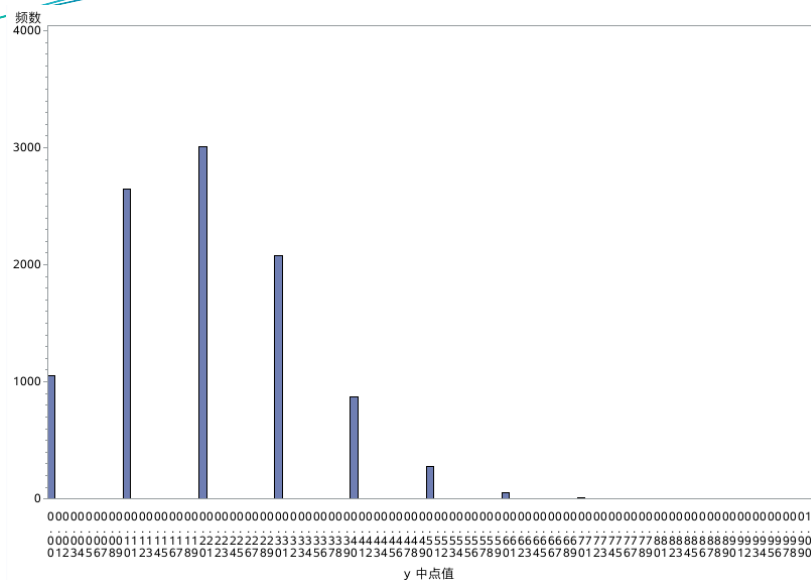
**The population rate is not equal to 0.5 ( $\pi \neq 0.5$ )?**

$$\pi=0.8 \quad \text{or} \quad \pi=0.2$$

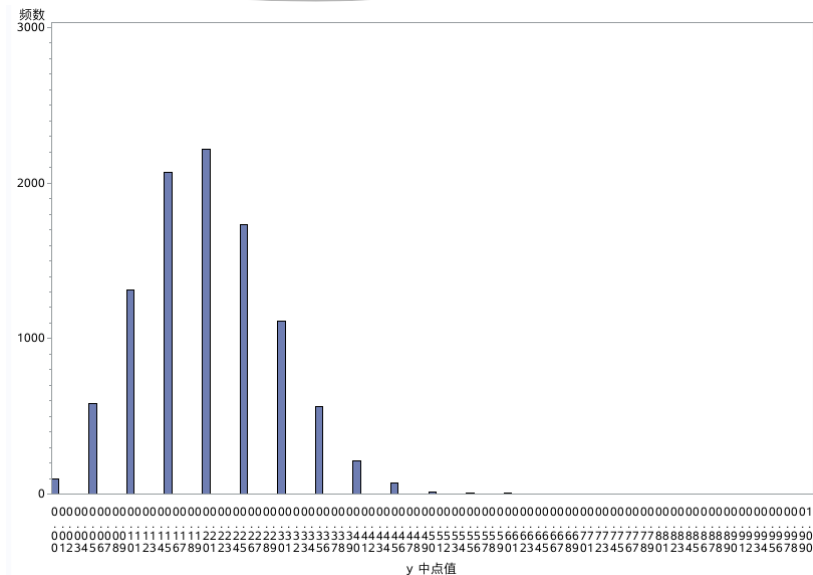
**What is the sampling distribution  
of sample rates in these cases?**



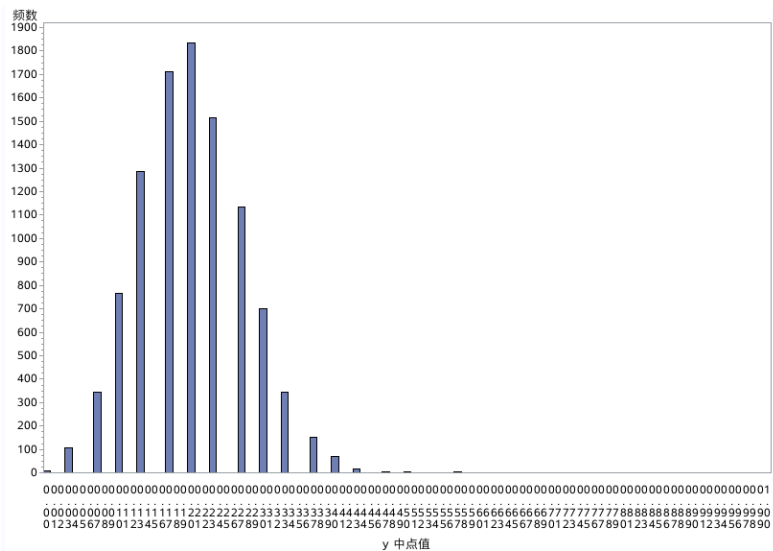
$\pi=0.2, n=10$



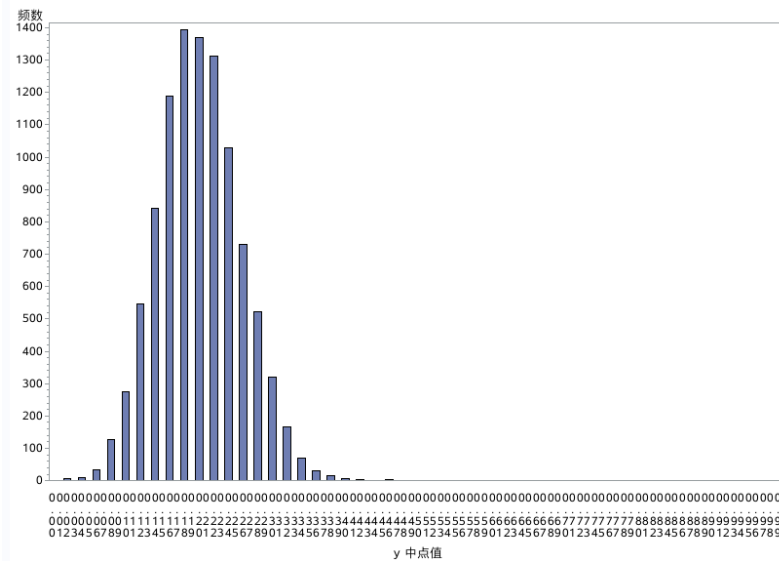
$\pi=0.2, n=20$



$\pi=0.2, n=30$



$\pi=0.2, n=50$



# Sampling distribution of sample rates

1.  $\mu_p = \pi$

2.  $\sigma_p = \sqrt{\frac{\pi(1-\pi)}{n}}$

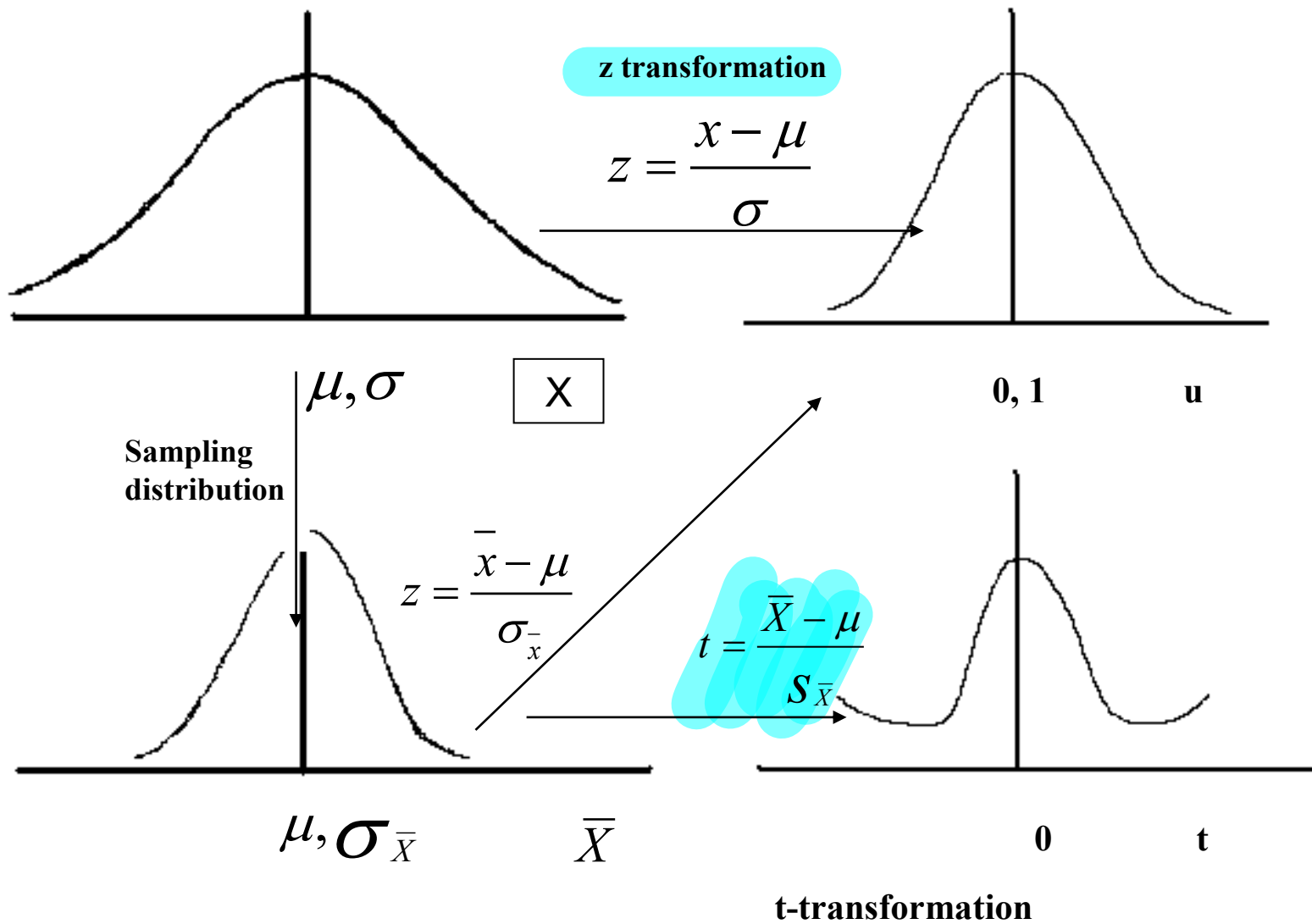
3. *If  $\pi$  is 0.5,  $p$  is normal.* **If  $\pi$  is not 0.5,  $p$  is approximately normally distributed when  $n\pi \geq 5$ ,  $n(1-\pi) \geq 5$ .**





## 3. *t* distribution

# t-transformation



# Who introduced $t$ distribution?

William Sealy Gosset



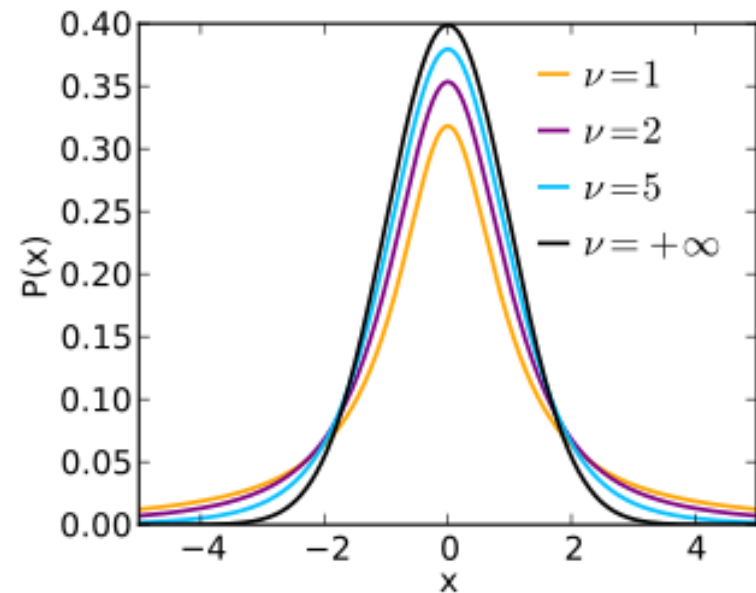
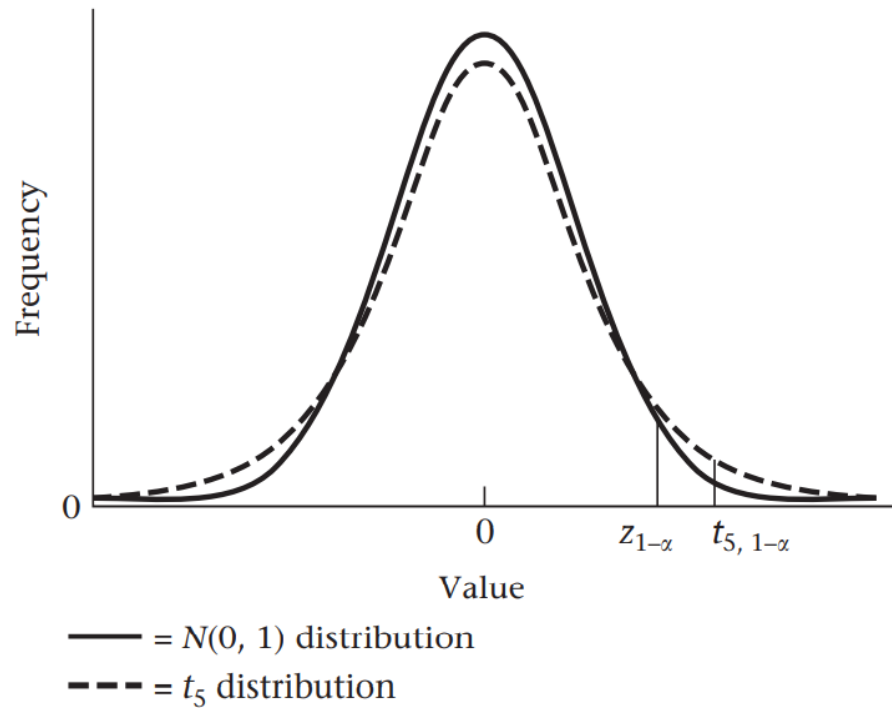
Student in 1908  
beer brewery in Gunnies

**$t$  distribution, was  
discovered by *W. S.  
Gossett [1876-1937].***

$$f(t) = \frac{\Gamma[(\nu + 1)/2]}{\sqrt{\pi\nu}\Gamma(\nu/2)} \left(1 + \frac{t^2}{\nu}\right)^{-\frac{(\nu+1)}{2}}$$

***Student's  $t$ -distribution***

# Student $t$ distribution



## Comparison of the 97.5th percentile of the $t$ distribution and the normal distribution

$d$	$t_{d,.975}$	$z_{.975}$	$d$	$t_{d,.975}$	$z_{.975}$
4	2.776	1.960	60	2.000	1.960
9	2.262	1.960	$\infty$	1.960	1.960
29	2.045	1.960			

# Characteristics of $t$ distribution curve

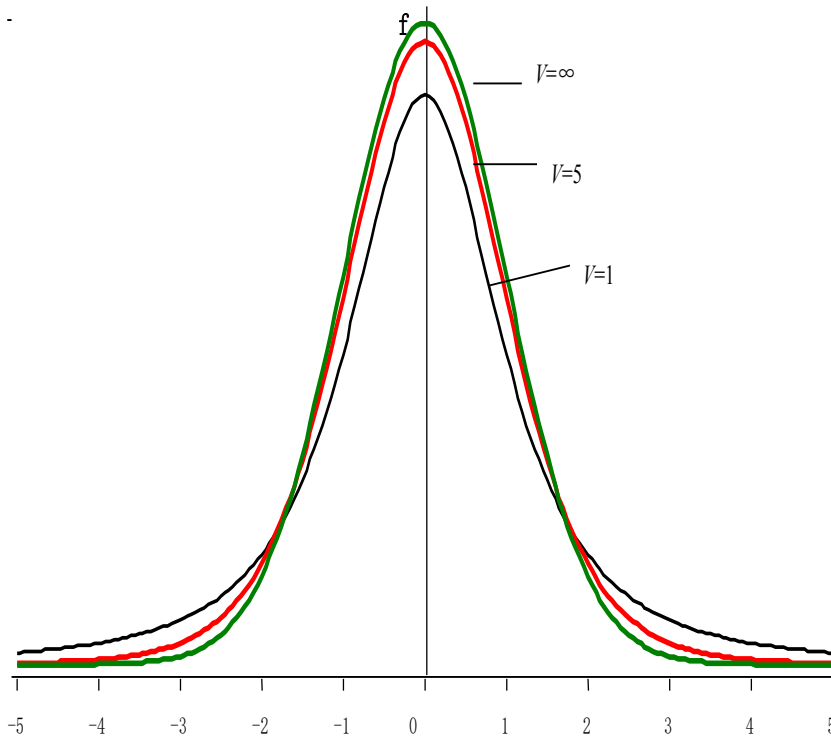
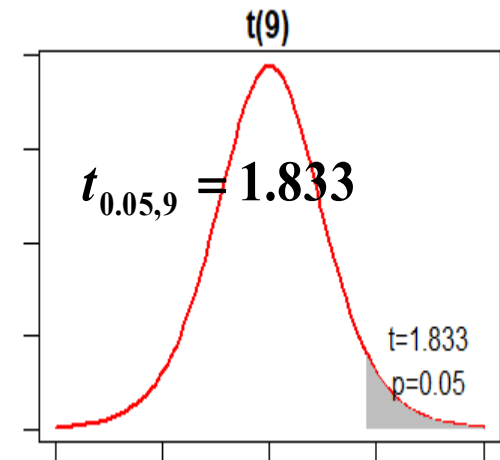
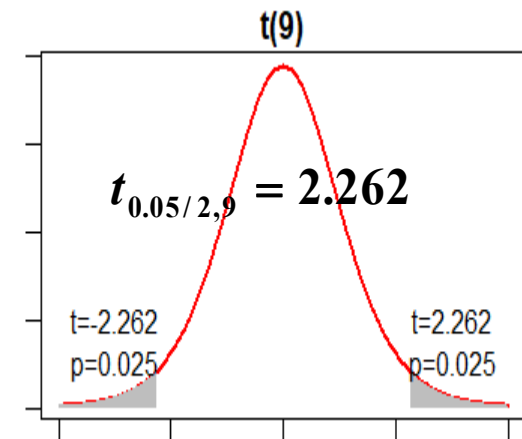


Figure 4-3 t-distribution graphs in different df

- It is symmetrical by y axis and has one apex;
- Only one parameter,  $v$  ( degree of freedom,  $v=n-1$ ) determines the shape of t distribution.
- The total area under the t distribution equals to 1.
- When  $v$  approaches  $\infty$ , t distribution approaches standard normal distribution

# *t statistic table*

df	<i>P</i>				
<i>v</i>	1-tail:	0.05	0.025	0.005	0.0005
	2-tail:	0.1	0.05	0.01	0.001
1		6.314	12.706	63.657	636.619
2		2.920	4.303	9.925	31.599
3		2.353	3.182	5.841	12.924
.....					
9		1.833	2.262	3.250	4.781
.....					
∞		1.645	1.960	2.576	3.291



# Summary

## ✓ Sampling distribution of sample means

1.  $\mu_{\bar{X}} = \mu_X$

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

3. *If  $X$  is normal,  $\bar{X}$  is normal. If  $X$  is nonnormal,  $\bar{X}$  is approximately normally distributed for sufficiently large sample size.*

# Summary

## ✓ $t$ distribution

$$Z = \frac{\bar{X} - \mu}{\sigma_{\bar{X}}}$$



$$t = \frac{\bar{X} - \mu}{s_{\bar{X}}}$$

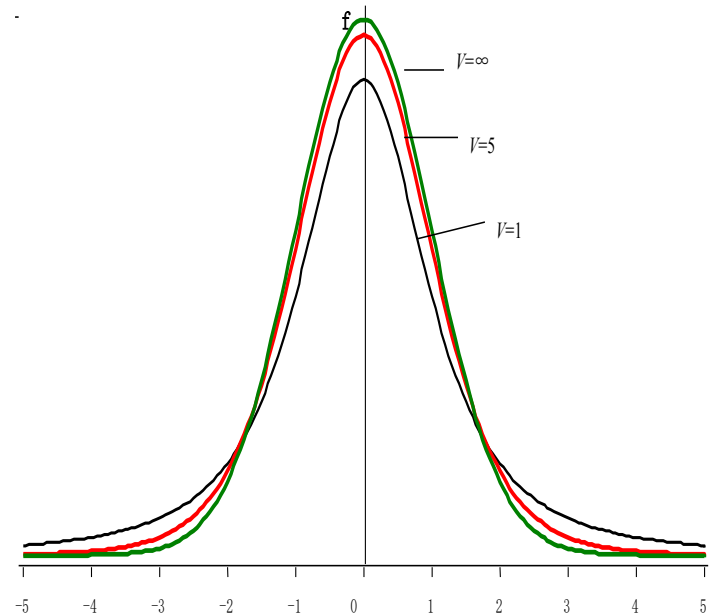
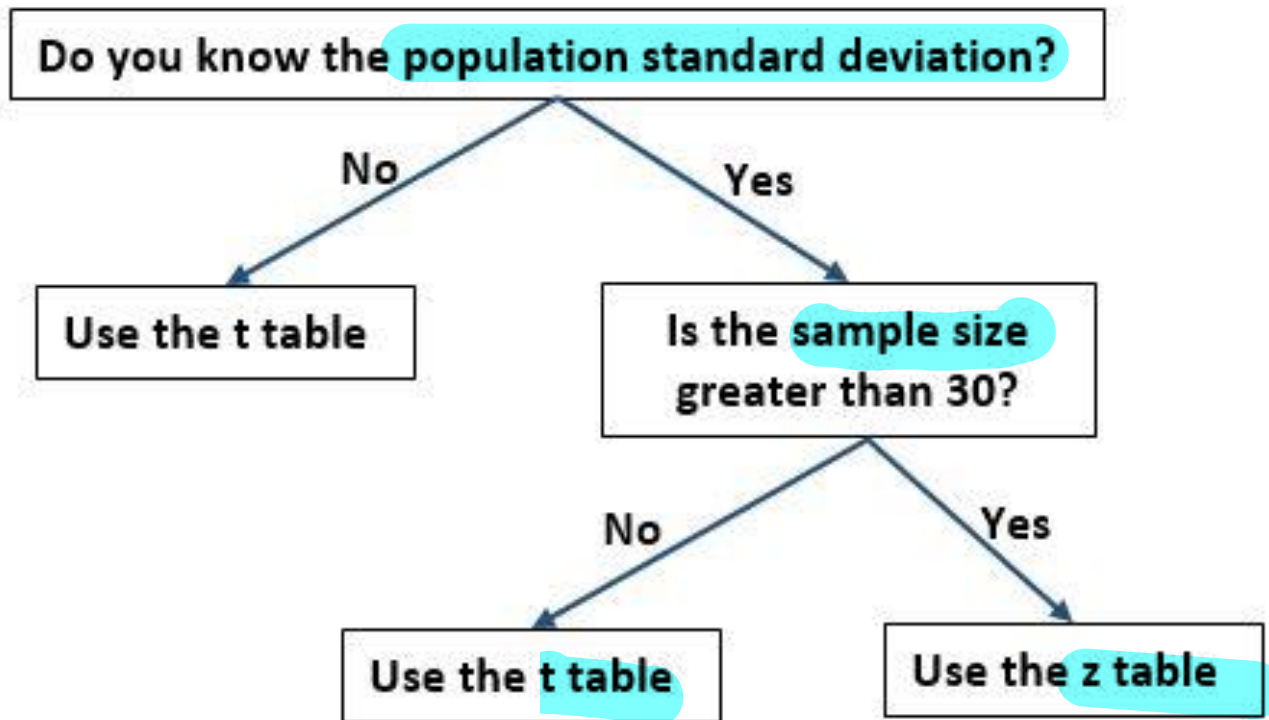


Figure 4-3 t-distribution graphs in different df







***Thank you!***

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法古今完人

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