# 통계분석 Statistical Analysis

# Testing Hypotheses: Continuous Random Variables

#### Testing Hypothesis: Normal Distribution

#### Example: IQs of People

IQ is normally distributed with standard deviation 15.

#### Hypotheses

 $H_0$  = The average IQ of People is 120.  $\mu = 120$  $H_a$  = The average IQ of People is greater than 120.  $\mu > 120$ 

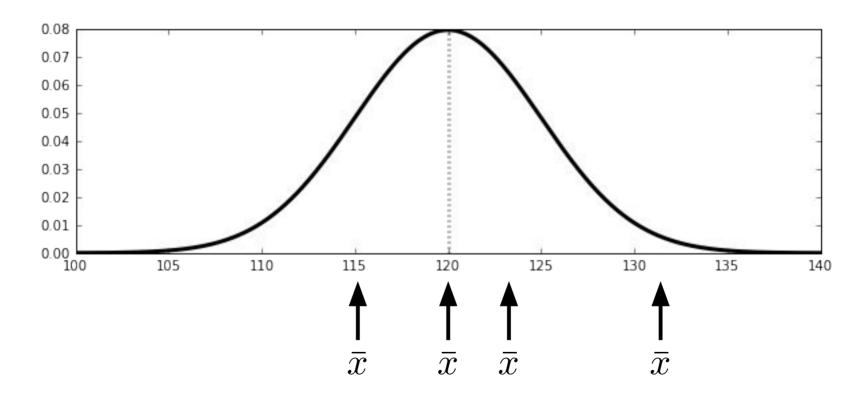
#### Experiments and Test statistics

IQ test for 9 people

A test statistic = Sample mean =  $\bar{x}$  $\bar{x} \sim N(\mu, \sigma^2/n = 15^2/9)$ 

#### Hypothesis Testing with Normal Distribution

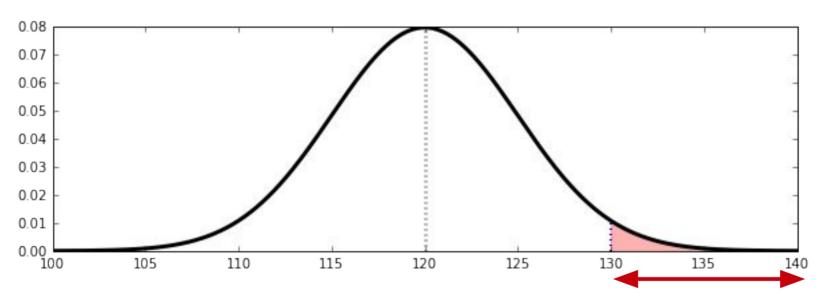
$$\bar{x} \sim N(\mu, \sigma^2/n = 15^2/9)$$



 $\bar{x}$  can have any value in principle, but each of  $\bar{x}$  has a different probability.

## Setting up Rejection Region

$$\bar{x} \sim N(\mu, \sigma^2/n = 15^2/9)$$



Rejection region:  $\bar{x} \geq 130$ 

- It means that if the sample mean of IQ of 9 people is greater 130, then we conclude that the null hypothesis is false.
- Since the alternative hypothesis is that the population average is larger than 120, the rejection region is upper-sided, not two-sided.

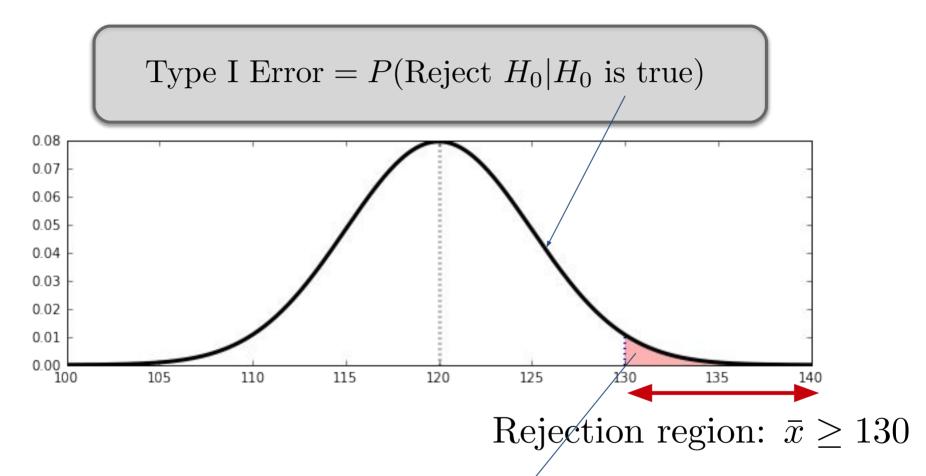
# Setting up Rejection Region

 $H_a$  = The average IQ of People is greater than 120.  $\mu > 120$ 

Rejection Region is upper-sided

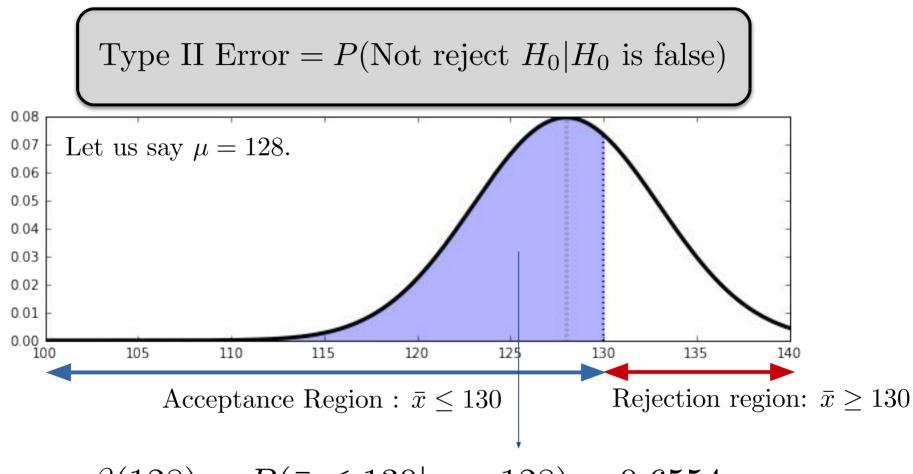
$$\mu < 120$$
 Rejection Region is lower-sided

$$\mu 
eq 120$$
 Rejection Region is Two-sided (both-sided)



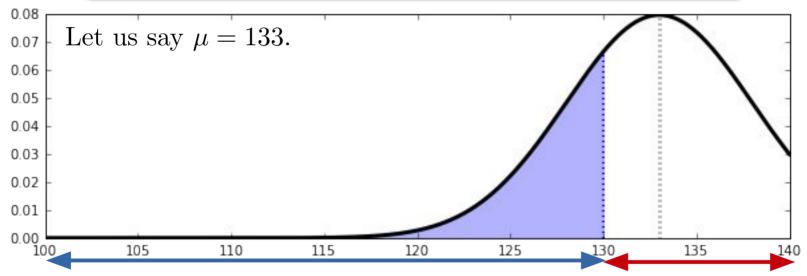
Even if the null hypothesis is true, it is possible that the sample mean is greater than 130.

$$\alpha = P(\bar{x} \ge 130 | \mu = 120) \approx 0.0228$$



$$\beta(128) = P(\bar{x} \le 130 | \mu = 128) \approx 0.6554$$

Type II Error =  $P(\text{Not reject } H_0|H_0 \text{ is false})$ 

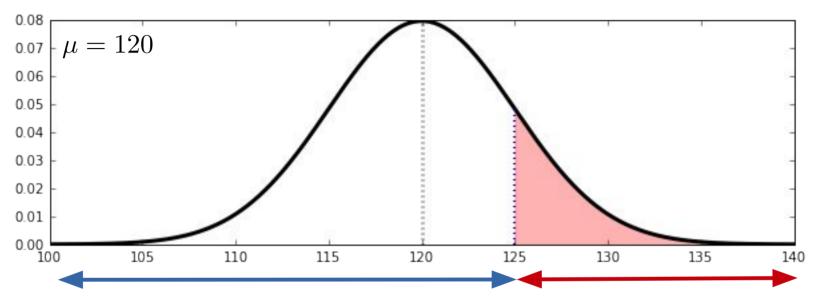


Acceptance Region :  $\bar{x} \le 130$ 

Rejection region:  $\bar{x} \geq 130$ 

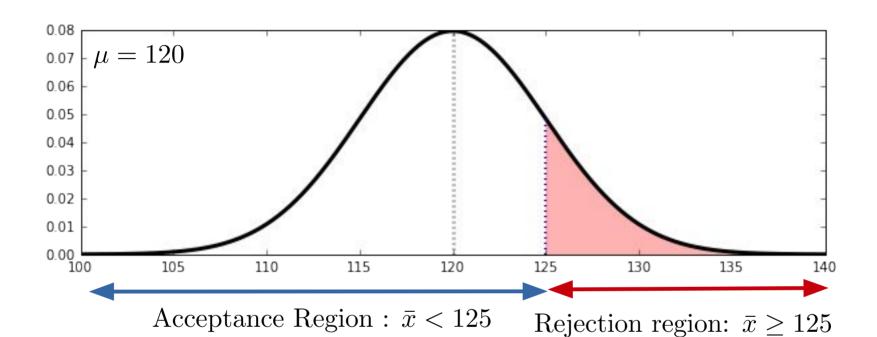
$$\beta(133) = P(\bar{x} \le 130 | \mu = 133) \approx 0.2743$$

### Changing Rejection Region



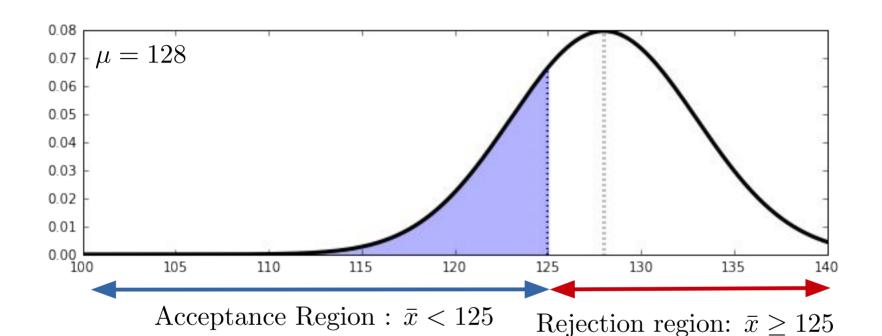
Acceptance Region :  $\bar{x} < 125$ 

Rejection region:  $\bar{x} \geq 125$ 



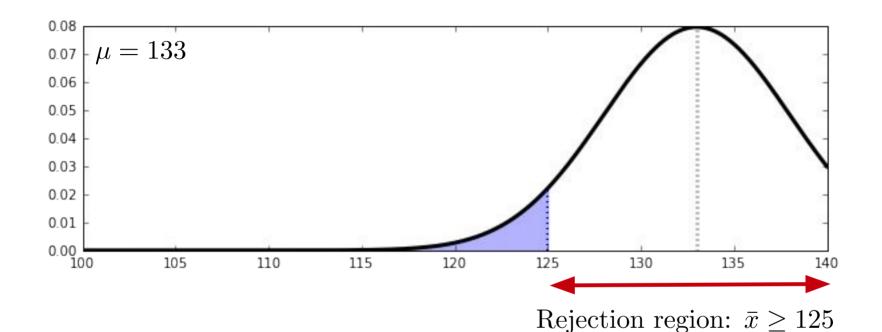
Type I Error =  $P(\text{Reject } H_0|H_0 \text{ is true})$ 

$$\alpha = P(\bar{x} \ge 125 | \mu = 120) \approx 0.1587$$



Type II Error =  $P(\text{Not reject } H_0|H_0 \text{ is false})$ 

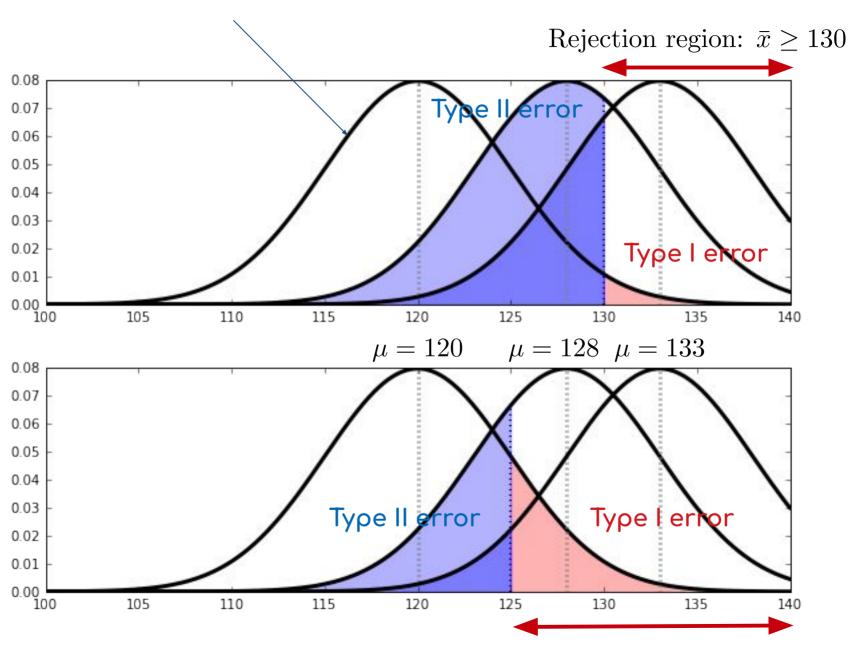
$$\beta(128) = P(\bar{x} \le 125 | \mu = 128) \approx 0.2743$$



Type II Error =  $P(\text{Not reject } H_0|H_0 \text{ is false})$ 

$$\beta(133) = P(\bar{x} \le 125 | \mu = 133) \approx 0.05480$$

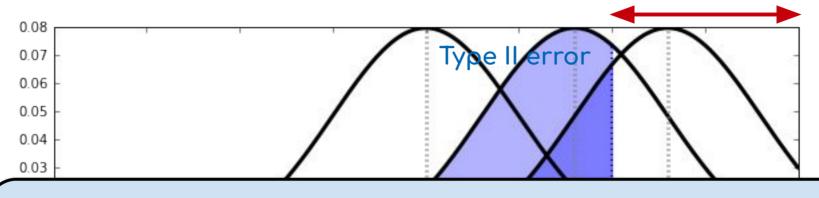
# **Errors**



Rejection region:  $\bar{x} \ge 125$ 

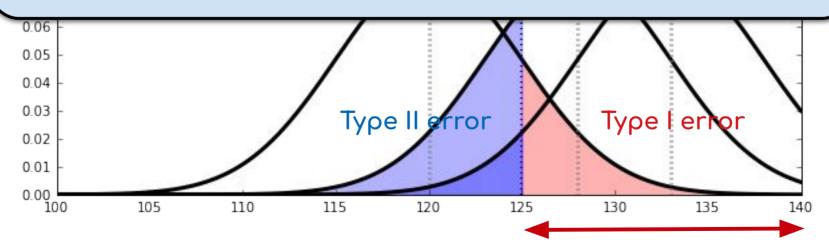
# **Errors**





#### Trade-off:

If we adjust the rejection region in order to decrease (increase) the type I error, the type II errors increase (decrease).



Rejection region:  $\bar{x} \ge 125$ 

# Significance Level: 유의 수준

- Previously, we specify the rejection region, and then calculate the type I error  $\alpha$ .
- We can do this reversely.
   First we specify the type I error of the test.
   Then we decide the rejection region that gives the type I error that we previously set up.
- The type I error that we set up is called the significance level (유의 수준).

significance level 
$$\alpha$$
 = type I error  
=  $P(\text{Reject } H_0 | H_0 \text{ is true})$ 

 $(1 - \alpha)$  = Probability that the null hypothesis is correct

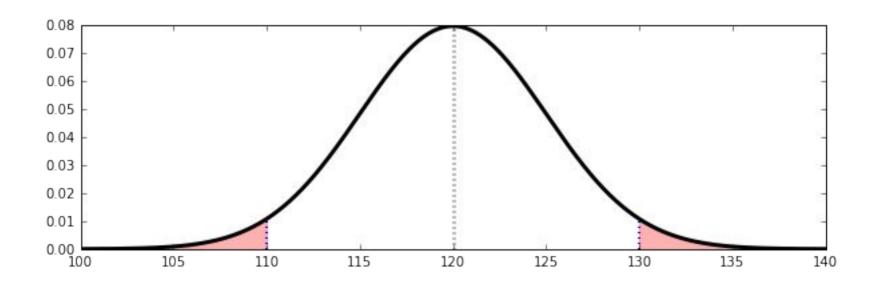
#### One-Sided and Two-Sided Tests: 단측검정과 양측검정

- Null Hypothesis:  $\theta = \theta_0$
- Alternative Hypothesis:  $\begin{cases} \theta \neq \theta_0 \\ \theta > \theta_0 \\ \theta < \theta_0 \end{cases}$

- Depending on the alternative hypothesis, the rejection region is different.
- 대립가설을 어떤 것을 선택하느냐에 따라 기각영역(rejection region)이 달라진다.

#### Two-Sided Rejection Regions

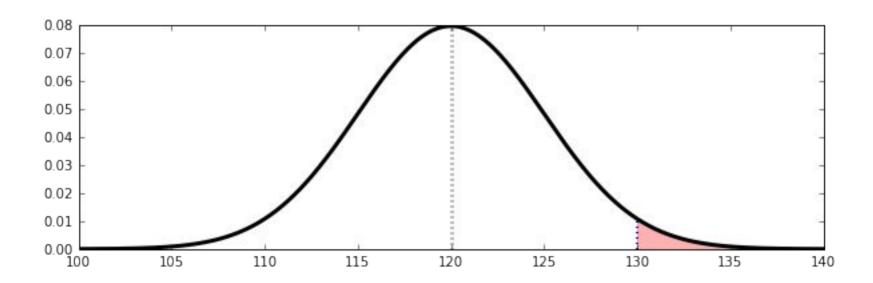
- Null Hypothesis:  $\theta = \theta_0$
- Alternative Hypothesis:  $\theta \neq \theta_0$



The rejection region is two-sided (or two-tailed).

#### One-Sided Rejection Region : Upper-tailed

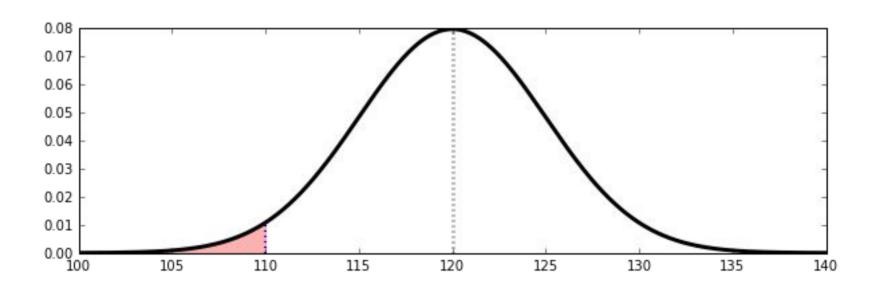
- Null Hypothesis:  $\theta = \theta_0$
- Alternative Hypothesis:  $\theta > \theta_0$



The rejection region is upper-tailed (우측검정).

#### One-Sided Rejection Region : Lower-tailed

- Null Hypothesis:  $\theta = \theta_0$
- Alternative Hypothesis:  $\theta < \theta_0$



The rejection region is lower-tailed (좌측검정).