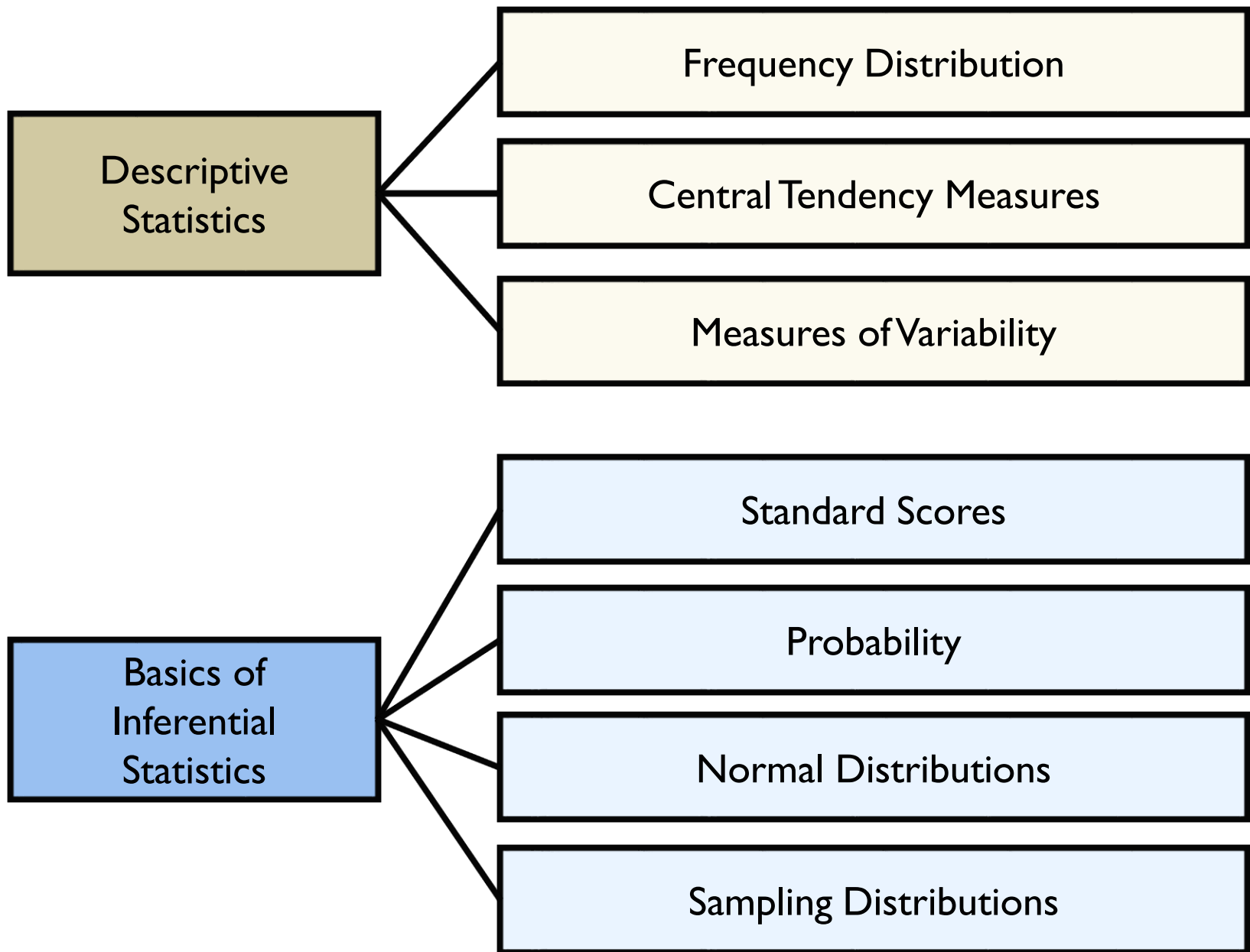


# **LECTURE 6**

## **BASICS OF INFERENTIAL STATISTICS: STANDARD SCORES & PROBABILITY**

PSY2002

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# WHY DO WE STANDARDIZE SCORES?

- Example:
  - A student received a score of 30 on a math test.
  - She also received a score of 50 on a reading test.
- Is 30 a high or low math score?
- Is 50 a high or low reading score?
- In educational and psychological testing, raw test scores may not be generally interpretable by themselves, but derive their meaning by comparison with other relative information, i.e., the responses of other people.

# WHY DO WE STANDARDIZE SCORES?

- Example:
  - A student received a score of 30 on a math test.
  - She also received a score of 50 on a reading test.
- Consider the following case.
  - $\mu_{\text{MATH}} = 10$   
30 is above the population mean. Her math ability is above the population average.
  - $\mu_{\text{READING}} = 65$   
50 is below the population mean. Her reading ability is below the population average.

# WHY DO WE STANDARDIZE SCORES?

- Example:
  - A student received a score of 30 on a math test.
  - She also received a score of 50 on a reading test.
- Consider the following case.
  - $\mu_{\text{MATH}} = 20$   
30 is above the population mean. Her math ability is above the population average.
  - $\mu_{\text{READING}} = 35$   
50 is above the population mean. Her reading ability is also above the population average.

# WHY DO WE STANDARDIZE SCORES?

- Example:
  - A student received a score of 30 on a math test.
  - She also received a score of 50 on a reading test.
- Consider the following case.
  - $\mu_{\text{MATH}} = 20, \sigma_{\text{MATH}} = 5$   
30 is above the population mean by 10. Her math ability is above the population average by 2 standard deviations.
  - $\mu_{\text{READING}} = 35, \sigma_{\text{READING}} = 3$   
50 is above the population mean by 15. Her reading ability is above the population average by 5 standard deviations.

# WHY DO WE STANDARDIZE SCORES?

- As shown in the previous examples, raw scores are not easily interpreted often times.
- To address this issue, we can transform the scores to a new metric (standard deviation unit) that is more easily interpreted.

# Z-SCORE

- In populations:

$$Z_i = \frac{X_i - \mu}{\sigma}$$

- In samples:

$$Z_i = \frac{X_i - \bar{X}}{s}$$

- The Z-score tells us how far the score is from the mean in standard deviation units.
- Z-scores are also called standardized scores.



# EXAMPLE I

- IQ scores are known to be distributed with  $\mu = 100$  and  $\sigma = 15$ . If my IQ score is 130, how high is my IQ score compared to other persons? Find the Z-score for my IQ score.

## EXAMPLE 2

- A student took 2 classes last semester. In class A, her total score was 25; In class B, she got a total score of 20. Given the following information, calculate her Z-score in each class and find if she performed better in class A or class B.
  - Class A:  $\bar{X} = 27, s = 2$
  - Class B:  $\bar{X} = 18, s = 4$

## EXAMPLE 3

- A national university entrance exam is known to be distributed with  $\mu = 100$  and  $\sigma = 20$ . I got a standard score of 1.5. Find my original score.

## EXAMPLE 4

- In a class, students whose final scores are lower than 50 will fail. I got to know that my final score is 2 standard deviations *below* the mean. The class mean is  $\bar{X} = 60$  and the class standard deviation is  $s = 4$ . Am I going to fail or not?

# PROPERTIES OF Z-SCORES

- If we transform each and every score in a distribution into the corresponding Z-score:
  - The mean of Z-scores is always 0.
  - The variance of Z-scores is always 1.
- The following slides explain why for population Z-scores. However, this property holds for both population Z-scores and sample Z-scores.

# PROPERTIES OF Z-SCORES

- If we add a constant to each and every score, the mean is also added by the same amount.
  - Mean of  $X_i = \mu$
  - Mean of  $(X_i - \mu) = \mu - \mu = 0$
- If we multiply each and every score by a constant, the mean is also multiplied by the same amount.
  - Mean of  $(X_i - \mu) = 0$
  - Mean of  $\frac{(X_i - \mu)}{\sigma} = \frac{0}{\sigma} = 0$
- The mean of Z-scores is always 0.

# PROPERTIES OF Z-SCORES

- If we add a constant to each and every score, the variance will not change.
  - Variance of  $X_i = \sigma^2$
  - Variance of  $(X_i - \mu) = \sigma^2$
- If we multiply each and every score by a constant, the variance will be multiplied by the squared constant.
  - Variance of  $(X_i - \mu) = \sigma^2$
  - Variance of  $\frac{(X_i - \mu)}{\sigma} = \frac{1}{\sigma^2} \cdot \sigma^2 = 1$
- The variance of Z-scores is always 1.
- The standard deviation of Z-scores is always 1.

# PROPERTIES OF Z-SCORES

- In any distribution, if we transform **each and every** score into the corresponding Z-score, the mean of the Z-scores is always 0 and the variance of the Z-scores is always 1.
- Regardless of the original measurement unit,
  - Z-scores are centered at the mean (i.e., 0 indicates the mean);
  - Z-scores are in the standard deviation unit (i.e., a one-unit increase in Z-score indicates 1 standard deviation increase).
- Therefore, Z-scores are often considered **unitless**.



# STANDARD SCORES (Z-SCORES)

- Standard scores are useful for locating a raw score compared to other scores in the distribution.
- However, we may need more information to interpret the substantial meaning of the scores.
- For example,
  - I got a blood test and my Hemoglobin level was 16g/dl. Is it normal? Or is this something that I should worry about?
  - I took an English speaking test and my score was 54. How good or bad is it? Am I qualified for teaching a class?

# STANDARD SCORES (Z-SCORES)

- Example 1: Hemoglobin = 16 g/dl
- The Hemoglobin levels of healthy persons are known to be distributed with a mean of 18.8 g/dl and a standard deviation of 1.4 g/dl.

$$\mu = 18.8, \sigma = 1.4$$

$$Z_i = \frac{X_i - \mu}{\sigma} = \frac{16 - 18.8}{1.4} = \frac{-2.8}{1.4} = -2$$

- The Z-score for my Hemoglobin level is 2 standard deviations below the population average.
- Okay, it is lower than the average. But, how bad is it? Am I anemic?

# STANDARD SCORES (Z-SCORES)

- Example 1:  $Z_i = -2$ ; how bad is it?
  - ➔ How much proportion of the entire population has a Z-score below -2?
- If 30% of the entire population has a Z-score below -2 (or Hemoglobin level below 16 g/dl), then I might not need to worry about my low Hemoglobin level. My Hemoglobin level would be normal.
- However, if only 0.01% of the entire population manifests a Z-score below -2 (or Hemoglobin level below 16 g/dl), then this indicates I am severely anemic and need a treatment.

# STANDARD SCORES (Z-SCORES)

- Example 2: English speaking test score = 54
- The test scores are known to be distributed with a mean of 45 and a standard deviation of 6.

$$\mu = 45, \sigma = 6$$

$$Z_i = \frac{X_i - \mu}{\sigma} = \frac{54 - 45}{6} = \frac{9}{6} = 1.5$$

- The Z-score for my English speaking test score is 1.5 standard deviations above the population average.
- Okay, my score is above the average. But, how good is it? Am I good enough to be qualified for teaching a class?

# STANDARD SCORES (Z-SCORES)

- Example 2:  $Z_i = 1.5$ ; how good is it?
  - ➔ How much proportion of the entire population has a Z-score above 1.5?
- If 45% of the entire population has a Z-score higher than 1.5 (or test score higher than 54), then my English speaking is not good enough to be qualified for teaching. I am top 45%.
- However, if only 1% of the entire population manifests a Z-score above 1.5 (or test score above 54), then this indicates I am very fluent in English and qualified for teaching. I am top 1%.

# PROBABILITY

- How can we obtain these proportions?
- Let's think about simple examples first.
- In a class, there are 60 female and 40 male students. What is the proportion of female students?  
→ 60% or 0.60

$$\begin{aligned}\text{proportion}(\text{female}) &= \frac{\text{number of female students}}{\text{total number of students}} \\ &= \frac{60}{40 + 60} = \frac{60}{100} = 0.60\end{aligned}$$

# PROBABILITY

- The terms proportion and probability are often used interchangeably.
- In a class, there are 60 female and 40 male students. If we randomly choose a student from this class, what is the probability of choosing a female student?

$$\text{probability of } A = \frac{\text{number of outcomes classified as } A}{\text{total number of possible outcomes}}$$

$$\text{probability (female)} = \frac{60}{100} = 0.60$$

# PROBABILITY

- More generally, if you are given the **frequency distribution** of scores, you can obtain the probability of getting a score
  - below a specific value
  - above a specific value
  - between two specific values

$$\text{probability of } A = \frac{\text{frequency of outcomes classified as } A}{\text{total frequency in the distribution}}$$



# PROBABILITY

- My Hemoglobin level = 16 g/dl

Hemoglobin (g/dl)

$X$	$f$
24-25.999	1
22-23.999	5
20-21.999	57
18-19.999	80
16-17.999	45
14-15.999	10
12-13.999	2

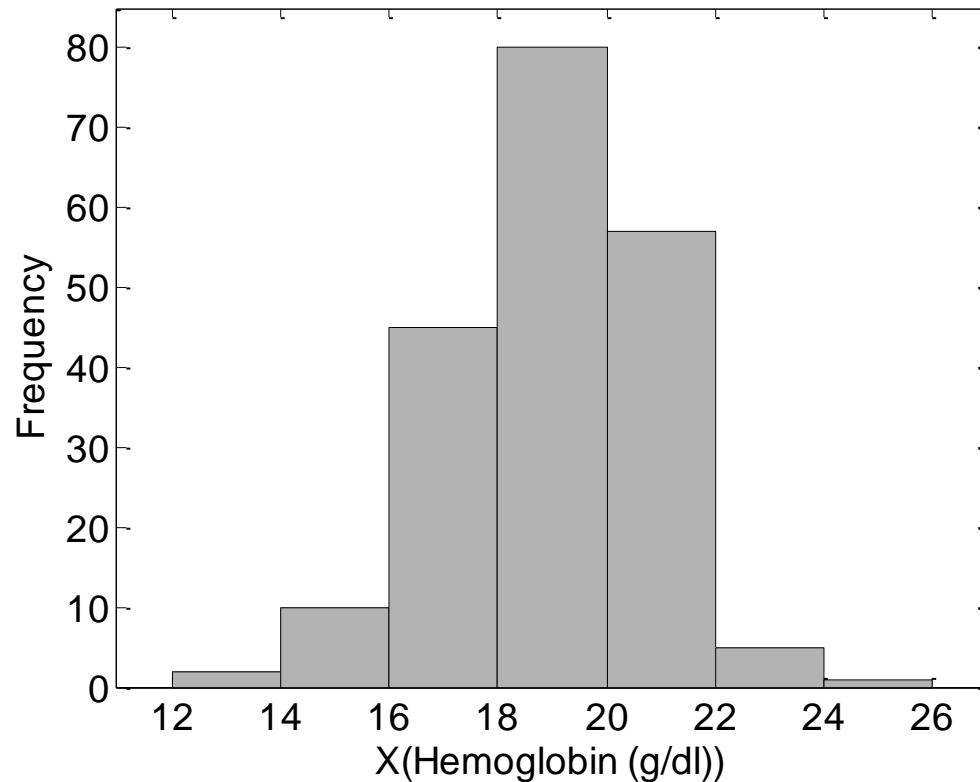
- How much proportion of the persons in this distribution has a Hemoglobin level below 16?
- What is the probability of choosing a person from this distribution who has a Hemoglobin level below 16?

$$P(X < 16) =$$

- My Hemoglobin level is in the

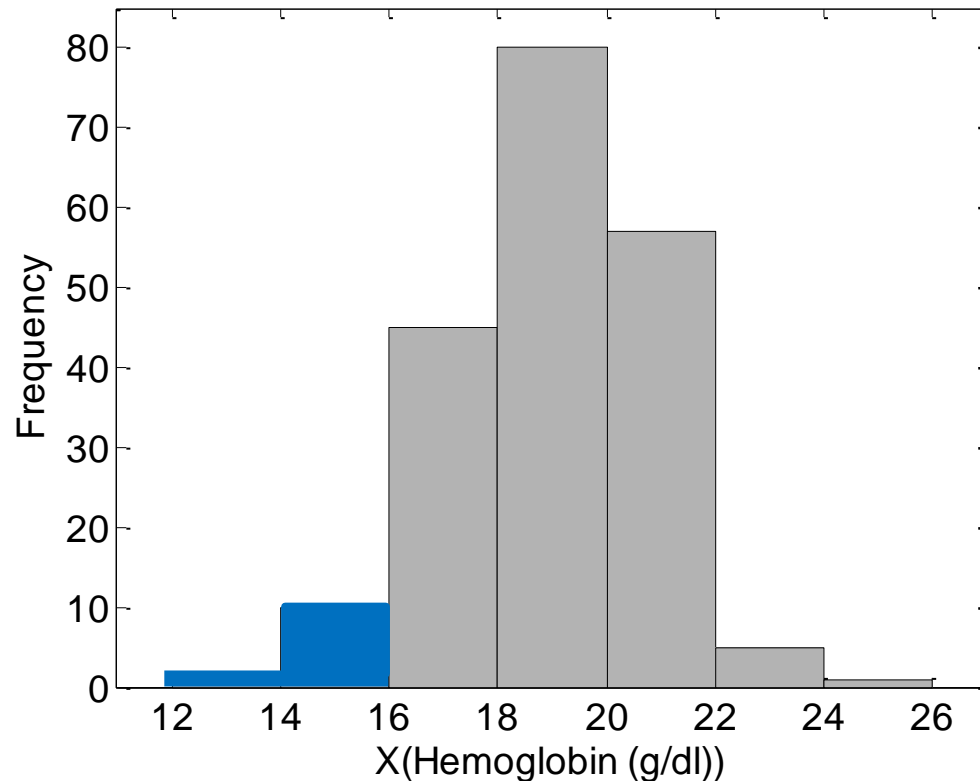
# PROBABILITY

- The area under the histogram is related with probability.



# PROBABILITY

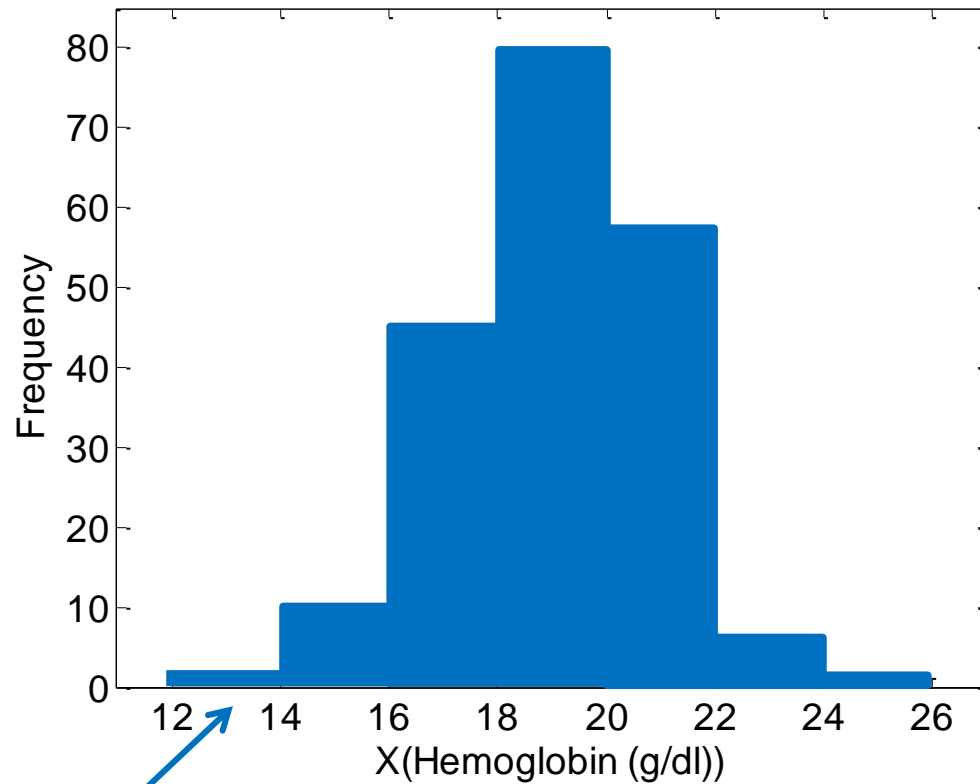
- The area under the histogram is related with probability.



The area under the histogram corresponding to  $X < 16$   
 $= (2)(2) + (2)(10) = 4 + 20 = 24$

# PROBABILITY

- The area under the histogram is related with probability.



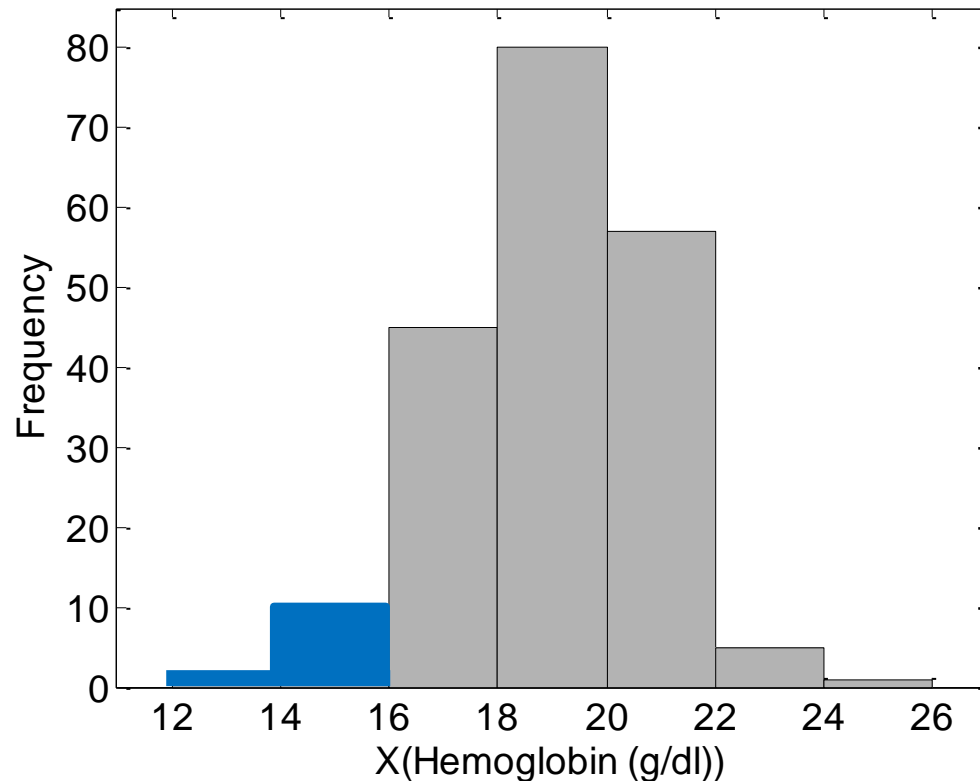
The total area under the histogram

$$= (2)(2) + (2)(10) + (2)(45) + (2)(80) + (2)(57) + (2)(5) + (2)(1)$$

$$= 4 + 20 + 90 + 160 + 114 + 10 + 2 = 400$$

# PROBABILITY

- The area under the histogram is related with probability.



$$P(X < 16) = \frac{\text{Area}(X < 16)}{\text{Total Area}} = \frac{24}{400} = 0.06$$

# SUMMARY (I)

- In populations:

$$Z_i = \frac{X_i - \mu}{\sigma}$$

- In samples:

$$Z_i = \frac{X_i - \bar{X}}{s}$$

- Z-scores are useful to see how far the score is from the mean in standard deviation units.

# SUMMARY (2)

- Probability and proportion are used interchangeably.
- When the frequency distribution is given, we can calculate the probability of a specific event A as follows:

$$\text{probability of } A = \frac{\text{frequency of outcomes classified as } A}{\text{total frequency in the distribution}}$$

- The area under the frequency graph is closely related to the probability.