# Lecture 17: Chapter 7, Section 3 Continuous Random Variables; Normal Distribution 

■Relevance of Normal Distribution
-Continuous Random Variables
-68-95-99.7 Rule for Normal R.V.s
$\square$ Standardizing/Unstandardizing
$\square$ Probabilities for Standard/Non-standard Normal R.V.s

## Looking Back: Review

## - 4 Stages of Statistics

- Data Production (discussed in Lectures 1-4)
- Displaying and Summarizing (Lectures 5-12)
- Probability
- Finding Probabilities (discussed in Lectures 13-14)
$\square$ Random Variables (introduced in Lecture 15)
- Binomial (discussed in Lecture 16)

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- Sampling Distributions
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- Statistical Inference


## Role of Normal Distribution in Inference

- Goal: Perform inference about unknown population proportion, based on sample proportion
- Strategy: Determine behavior of sample proportion in random samples with known population proportion
- Key Result: Sample proportion follows normal curve for large enough samples.
Looking Ahead: Similar approach will be taken with means.


## Discrete vs. Continuous Distributions

- Binomial Count $X$
- discrete (distinct possible values like numbers 1, 2, 3, ...)
- Sample Proportion $\widehat{p}=\frac{X}{n}$
- also discrete (distinct values like count)
- Normal Approx. to Sample Proportion
- continuous (follows normal curve)

ㅁ Mean $p$, standard deviation $\sqrt{\frac{p(1-p)}{n}}$

## Sample Proportions Approx. Normal (Review)

- Proportion of tails in $n=16$ coinflips $(p=0.5)$ has $\mu=0.5, \sigma=\sqrt{\frac{0.5(1-0.5)}{16}}=0.125$, shape approx normal - Proportion of lefties ( $p=0.1$ ) in $n=100$ people has

$$
\mu=0.1, \sigma=\sqrt{\frac{0.1(1-0.1)}{100}}=0.03 \text {, shape approx normal }
$$




## Example: Variable Types

$\square$ Background: Variables in survey excerpt:

| age | breakfast? | comp | credits | $\cdots$ |
| ---: | ---: | ---: | ---: | ---: |
| 19.67 | no | 120 | 15 |  |
| 20.08 | no | 120 | 16 |  |
| 19.08 | yes | 40 | 14 |  |
| $\ldots$ | $\ldots$ | $\ldots$ | $\cdots$ |  |

- Question: Identify type (cat, discrete quan, continuous quan)
- Age? Breakfast? Comp (daily min. on computer)? Credits?
$\square$ Response:
- Age:
- Breakfast:
- Comp (daily time in min. on computer
- Credits:


## Probability Histogram for Discrete R.V.

Histogram for male shoe size $X$ represents probability by area of bars

- $\mathrm{P}(X \leq 9)$ (on left)
- $\mathrm{P}(X<9)$ (on right)



For discrete R.V., strict inequality or not matters.

## Definition

Density curve: smooth curve showing prob. dist. of continuous R.V. Area under curve shows prob. that R.V. takes value in given interval.
Looking Ahead: Most commonly used density curve is normal z but to perform inference we also use $\boldsymbol{t}, \boldsymbol{F}$, and chi-square curves.

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Elementary Statistics: Looking at the Big Picture


## Density Curve for Continuous R.V.

Density curve for male foot length $X$ represents probability by area under curve.


$$
P(X \leq 9)=P(X<9)
$$

Continuous RV: strict inequality or not doesn't matter. A Closer Look: Shoe sizes are discrete; foot lengths are continuous.

## 68-95-99.7 Rule for Normal Data (Review)

## Values of a normal data set have

- $68 \%$ within 1 standard deviation of mean
- $95 \%$ within 2 standard deviations of mean
- $99.7 \%$ within 3 standard deviations of mean

68-95-99.7 Rule for Normal Distributions


## 68-95-99.7 Rule: Normal Random Variable

Sample at random from normal population; for sampled value $X$ (a R.V.), probability is

- $68 \%$ that $X$ is within 1 standard deviation of mean
- $95 \%$ that $X$ is within 2 standard deviations of mean
- $99.7 \%$ that $X$ is within 3 standard deviations of mean



## 68-95-99.7 Rule: Normal Random Variable

Looking Back: We use Greek letters to denote population mean and standard deviation. mean $=\mu$, standard deviation $=\sigma$


## Example: 68-95-99.7 Rule for Normal R.V.

$\square$ Background: IQ for randomly chosen adult is normal R.V. $X$ with $\mu=100, \sigma=15$.

- Question: What does Rule tell us about distribution of $X$ ?
- Response: We can sketch distribution of $X$ :



## Example: Finding Probabilities with Rule

- Background: IQ for randomly chosen adult is normal R.V. $X$ with $\mu=100, \sigma=15$.
- Question: Prob. of IQ between 70 and $130=$ ?
- Response:



## Example: Finding Probabilities with Rule

- Background: IQ for randomly chosen adult is normal R.V. $X$ with $\mu=100, \sigma=15$.
$\square$ Question: Prob. of IQ less than $70=$ ?
$\square$ Response:



## Example: Finding Probabilities with Rule

- Background: IQ for randomly chosen adult is normal R.V. $X$ with $\mu=100, \sigma=15$.
- Question: Prob. of IQ less than $100=$ ?
$\square$ Response:



## Example: Finding Values of $X$ with Rule

- Background: IQ for randomly chosen adult is normal R.V. $X$ with $\mu=100, \sigma=15$.
- Question: Prob. is 0.997 that IQ is between...?
$\square$ Response:



## Example: Finding Values of $X$ with Rule

- Background: IQ for randomly chosen adult is normal R.V. $X$ with $\mu=100, \sigma=15$.
$\square$ Question: Prob. is 0.025 that IQ is above...?
$\square$ Response:



## Example: Using Rule to Evaluate Probabilities

- Background: Foot length of randomly chosen adult male is normal R.V. $X$ with $\mu=11, \sigma=1.5$ (in.)
$\square$ Question: How unusual is foot less than 6.5 inches?
$\square$ Response:



## Example: Using Rule to Estimate Probabilities

- Background: Foot length of randomly chosen adult male is normal R.V. $X$ with $\mu=11, \sigma=1.5$ (in.)
$\square$ Question: How unusual is foot more than 13 inches?
$\square$ Response:



## Definition (Review)

$\square \boldsymbol{z}$-score, or standardized value, tells how many standard deviations below or above the mean the original value is:

$$
z=\frac{\text { value-mean }}{\text { standard deviation }}
$$

- Notation for Population: $z=\frac{x-\mu}{\sigma}$
- $z>0$ for $x$ above mean
- $z<0$ for $x$ below mean

ㅁ Unstandardize: $x=\mu+z \sigma$

## Standardizing Values of Normal R.V.s

Standardizing to $z$ lets us avoid sketching a different curve for every normal problem: we can always refer to same standard normal $(z)$ curve:


## Example: Standardized Value of Normal R.V.

- Background: Typical nightly hours slept by college students normal; $\mu=7, \sigma=1.5$
- Question: How many standard deviations below or above mean is 9 hours?
- Response: Standardize to $z=$
(9 is
standard deviations above mean)



## Example: Standardizing/Unstandardizing

 Normal R.V.- Background: Typical nightly hours slept by college students normal; $\mu=7, \sigma=1.5$.
- Questions:
- What is standardized value for sleep time 4.5 hours?
- If standardized sleep time is +2.5 , how many hours is it?
$\square$ Responses:
- $z=$

■

## Interpreting $z$-scores (Review)

## This table classifies ranges of $z$-scores informally, in terms of being unusual or not.

| Size of $z$ | Unusual? |
| :--- | :--- |
| $\|z\|$ greater than 3 | extremely unusual |
| $\|z\|$ between 2 and 3 | very unusual |
| $\|z\|$ between 1.75 and 2 | unusual |
| $\|z\|$ between 1.5 and 1.75 | maybe unusual (depends on circumstances) |
| $\|z\|$ between 1 and 1.5 | somewhat low/high, but not unusual |
| $\|z\|$ less than 1 | quite common |

> Looking Ahead: Inference conclusions will hinge on whether or not a standardized score can be considered "unusual".

## Example: Characterizing Normal Values Based on $z$-Scores

- Background: Typical nightly hours slept by college students normal; $\mu=7, \sigma=1.5$.
$\square$ Questions: How unusual is a sleep time of 4.5 hours $(z=-1.67)$ ? 10.75 hours $(z=+2.5)$ ?
$\square$ Responses:
- Sleep time of 4.5 hours $(z=-1.67)$ :
- Sleep time of 10.75 hours $(z=+2.5)$ :

| Size of $z$ | Unusual? |
| :---: | :---: |
| $\|z\|$ greater than 3 | extremely unusual |
| $\|z\|$ between 2 and 3 | very unusual |
| $\|z\|$ between 1.75 and 2 | unusual |
| $\|z\|$ between 1.5 and 1.75 | maybe unusual (depends on circumstances) |
| $\|z\|$ between 1 and 1.5 <br> \|z| less than 1 | somewhat low/high, but not unusual |
| less than | e common |

## Normal Probability Problems

- Estimate probability given $z$
- Probability close to 0 or 1 for extreme $z$
- Estimate $z$ given probability
- Estimate probability given non-standard $x$
- Estimate non-standard $x$ given probability


## Example: Estimating Probability Given z

- Background: Sketch of 68-95-99.7 Rule for $Z$

- Question: Estimate $\mathbf{P}(\boldsymbol{Z}<-1.47)$ ?
$\square$ Response:


## Example: Estimating Probability Given z

- Background: Sketch of 68-95-99.7 Rule for $Z$

$\square$ Question: Estimate $\mathbf{P}(\mathbb{Z}>+0.75)$ ?
$\square$ Response:


## Example: Estimating Probability Given z

ㅁ Background: Sketch of 68-95-99.7 Rule for $Z$


- Question: Estimate $\mathbf{P}(\mathbf{Z}<+2.8)$ ?
$\square$ Response:


## Example: Probabilities for Extreme z

- Background: Sketch of 68-95-99.7 Rule for $Z$

$\square$ Question: What are the following (approximately)?
a. $\mathrm{P}(\mathrm{Z}<-14.5)$ b. $\mathrm{P}(\mathrm{Z}<+13)$
c. $P(Z>+23.5)$ d. $P(Z>-12.1)$
$\square$ Response:
a.
$\square$ b.
c.
d.


## Example: Estimating z Given Probability

- Background: Sketch of 68-95-99.7 Rule for $Z$

- Question: Prob. is 0.01 that $Z<$ what value?
$\square$ Response:


## Example: Estimating z Given Probability

- Background: Sketch of 68-95-99.7 Rule for $Z$

$\square$ Question: Prob. is 0.15 that $Z>$ what value?
- Response:


## Example: Estimating Probability Given $x$

$\square$ Background: Hrs. slept $X$ normal; $\mu=7, \sigma=1.5$.


- Question: Estimate $\mathbf{P}\left(X^{\prime}>9\right)$ ?
$\square$ Response:


## Example: Estimating Probability Given $x$

$\square$ Background: Hrs. slept $X$ normal; $\mu=7, \sigma=1.5$.

$\square$ Question: Estimate $\mathbf{P}\left(\mathbf{6}^{z}<\boldsymbol{X}<\mathbf{8}\right) ?$ ? $\begin{aligned} & \text { A Closer Look: } \text { are the quartiles of the } z \text { curve. }\end{aligned}$
$\square$ Response:

## Example: Estimating x Given Probability

$\square$ Background: Hrs. slept $X$ normal; $\mu=7, \sigma=1.5$.

$\square$ Question: 0.04 is $\mathrm{P}(X<$ ? )
$\square$ Response:

## Example: Estimating x Given Probability

$\square$ Background: Hrs. slept $X$ normal; $\mu=7, \sigma=1.5$.


- Question: 0.20 is $\mathrm{P}(X>$ ? $)$
$\square$ Response:


## Strategies for Normal Probability Problems

- Estimate probability given non-standard $x$
- Standardize to $z$
- Estimate probability using Rule
- Estimate non-standard $x$ given probability
- Estimate $z$
- Unstandardize to $x$


## Lecture Summary

(Normal Random Variables)
$\square$ Relevance of normal distribution

- Continuous random variables; density curves
- 68-95-99.7 Rule for normal R.V.s
- Standardizing/unstandardizing
- Probability problems
- Find probability given $z$
- Find $z$ given probability
- Find probability given $x$
- Find $x$ given probability

