

Announcements:

- We will start using R Commander again
- Friday discussion is for credit.

Homework: (Due Wed, Feb 20)

See handout on website, in daily calendar.
Use R Commander or Excel. Instructions on using R Commander for binomial probabilities are on the website in the R Commander section (and in today's lecture).
Instructions using Excel are in the book (p. 278).

Today:

- Section 8.4 (binomial)
- Power point on research on psychics, if time

Section 8.4: Binomial Random Variables

What do the following random variables have in common?

Example 1: A fair coin is flipped 10 times,
 X = number of heads.

Example 2: Ten births are observed at a hospital,
 X = number of boys. For simplicity, assume $P(\text{Boy})=.5$

Example 3: A student takes a 10 question true/false test,
just guessing, X = number correct.

Example 4: Suppose *half* of all adults think genetically modified food is unsafe. Take a random sample of 10 adults, X = number (out of the 10 polled) who think this.

What do those random variables all have in common?

Each of these random variables has the exact same probability distribution function!

$P(X = 0) = (\frac{1}{2})^{10}$ [Ex 1: $X = 0$ heads => TTTTTTTTTT]
 $P(X = 1)$ is the same for all of them, and so on.
Note that X can be 0, 1, 2, ..., 10

In each case, X is called a **binomial random variable** with $n=10$ and $p=\frac{1}{2}$.

It is the outcome of a **binomial experiment**.

Properties of a Binomial Experiment

1. There are n "trials" where n is determined in advance. (10 Coin flips, births, T/F questions, adults polled)
2. There are *the same two possible outcomes* on each trial, called "success" and "failure" and denoted S and F. (Heads/tails; Boy/girl; Right/wrong, Unsafe/not unsafe)
3. The *outcomes are independent* from one trial to the next. Knowledge of one does not help predict the next one. (True for all 4 examples.)
4. The *probability of a "success" remains the same* from one trial to the next, and this probability is denoted by p . The probability of a "failure" is $1-p$ for every trial.

Note that $n = 10$ and $p = 1/2$ for each example given.

NOTE: $p = 1/2$ is not always the case!

For example, multiple choice test with 4 choices, student is just guessing, $p = 1/4$.

A **binomial random variable** is defined as X = number of successes in the n trials of a binomial experiment.

Two examples (one binomial, one not):

Weekly quiz has 5 questions with 4 choices per question, worth 2 points each. Suppose someone is just guessing.

X = Number of questions correct

X is a binomial random variable, $n = 5$ and $p = 1/4$

Y = Points earned for the quiz = $2X$

Y is **not** a binomial random variable (but $Y/2$ is).

Examples that **are not** binomial experiments:

1. A chess player plays 12 *different* opponents in a tournament, X = number of games won.

p = Probability of win does *not* stay the same

Condition #4 does not hold.

2. Woman decides to have children until she has one girl or 4 children, whichever comes first.

Number of "trials" is not fixed in advance (**Condition #1**).

3. Deal a poker hand of 5 cards, X = number of aces.

Cards are drawn *without replacement* so outcomes are NOT independent (also, p changes). (**Conditions #3, #4**)

Once you recognize a binomial random variable, the pdf is always given by this formula (so you don't have to rely on Chapter 7 rules each time!):

Probability of exactly k successes:

$$P(X = k) = \frac{n!}{k!(n-k)!} p^k (1-p)^{n-k} \text{ for } k = 0, 1, 2, \dots, n.$$

Factorial notation: $n! = 1 \times 2 \times 3 \times \dots \times (n-1) \times (n)$

$0! = 1$, by convention.

EX: If just guessing, what is the probability of getting exactly 2 quiz questions right (out of 5 for the week)?

$n = 5$ ["trials" = questions], $p = .25$ [success prob.], $k = 2$

$$P(X = 2) = \frac{5!}{2!(5-2)!} (.25)^2 (1-.25)^{5-2} = 10(.0625)(.4219) = .2637$$

What is the probability of getting 0 questions right?

$$P(X = 0) = \frac{5!}{0!5!} (.75)^5 = (.75)^5 = .2373$$

How is the pdf formula found? Use Chapter 7 rules.

Simpler example: $n = 3, p = .25, k = 2$:

$$P(X = 2) = \frac{3!}{2!(3-2)!} (.25)^2 (1-.25)^{3-2} = 3(.0625)(.75) = .14$$

• Individual string of k successes and $(n - k)$ failures has probability $p^k(1-p)^{n-k}$ Example: $P(\text{SSF}) = (.25)(.25)(.75)$

• There are $\frac{n!}{k!(n-k)!}$ possible ways to get k successes

Example: $n = 3, k = 2$, could be {SSF, SFS, FSS}

$$\frac{n!}{k!(n-k)!} = \frac{3!}{2!(3-2)!} = \frac{3 \times 2 \times 1}{(2 \times 1)(1)} = 3$$

Mean and standard deviation for binomial random variables (only!):

Mean = expected value of $X = E(X) = \mu = np$

Variance = $\sigma^2 = np(1-p)$; **standard deviation** = $\sqrt{np(1-p)}$

Example:

$n = 10, p = 0.2$

mean = $(10)(0.2) = 2$

standard deviation = $\sqrt{10(.2)(.8)} = \sqrt{1.6} = 1.265$

(not much use for now, but will be very useful soon)

Let's look at some pictures of binomial pdfs with different n 's and p 's.

Use computer to find binomial probabilities (pdf and cdf):

Excel – See page 278

=BINOMDIST(k,n,p,false) for the pdf

=BINOMDIST(k,n,p,true) for the cdf

(You type the equal sign then the command in any cell and it will put the requested probability in that cell.)

EX (previous slide):

=BINOMDIST(2,3,.25,false) would give .14

R Commander: See instructions linked to website.

For pdf: *Distributions* → *Discrete distributions* →

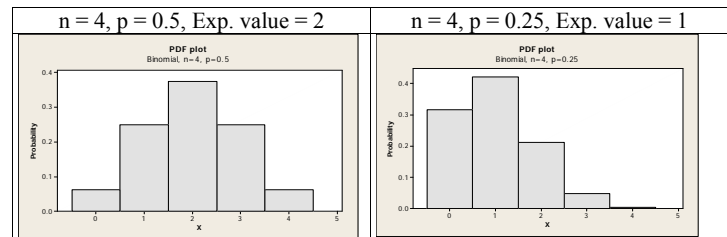
Binomial distribution → *Binomial probabilities*

(then fill in n and p in the popup box)

Binomial pdfs, $n = 4$ and $p = .5$ (on left) or $.25$ (on right)

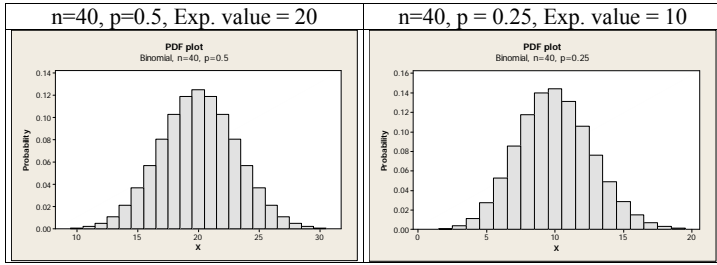
$E(X) = np$ is $(4)(.5) = 2$

$E(X) = np = 4(.25) = 1$



Binomial pdfs, $n = 40$ and $p = .5$ (left) or $.25$ (right):

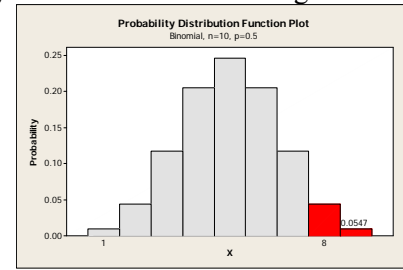
$E(X) = np$ is $(40)(.5) = 20$ $E(X) = np = 40(.25) = 10$



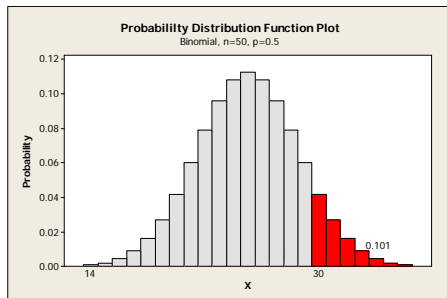
Notice how the “shape” is getting close to bell-shaped!

For binomial, CDF is often more interesting than PDF.
Ex: Test has 10 questions, pass if 80%, 8 or more, correct.

Find $P(X = 8, 9, 10) = P(X \geq 8) = 1 - P(X \leq 7) = 1 - \text{cdf}$
for $X = 7$, which is $1 - .94531 = .0547$ (if just guessing)
Probability = sum of areas of rectangles for those values!



Now suppose test has 50 questions, you need 60% correct to pass, so need 30 questions correct. If just guessing, $P(X \geq 30) = 1 - P(X \leq 29) = 1 - .899 = .101$
 $= P(30)+P(31)+P(32)+\dots+P(50)$



Ex: Political poll with $n = 1000$.
Suppose *true* $p = .48$ in favor of a candidate.
 X = number in poll who say they support the candidate.
 X is a **binomial random variable**, $n = 1000$ and $p = .48$.

- n trials = 1000 people (without replacement, but for large population treat as if with replacement)
- “*success*” = support, “*failure*” = doesn’t support
- Trials are *independent*, knowing how one person answered doesn’t change others probabilities
- $p = .48$ remains fixed at for each random draw of a person to ask

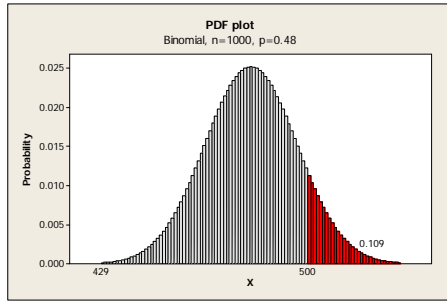
Mean = $np = (1000)(.48) = 480$.

Standard dev, = $\sqrt{np(1-p)} = \sqrt{1000(.48)(.52)} = 15.8$

What is the probability that *at least half* of the *sample* support the candidate? (Remember only 48% of *population* supports him or her.)

$$P(X \geq 500) = P(X = 500) + P(X = 501) + \dots + P(X = 1000).$$

Using Excel: $1 - P(X \leq 499) = 1 - .891 = .109$.



Note what this says:

In polls of 1000 people in which 48% favor something, the poll will say *at least half favor it* with probability of just over .10 or in just over 10% of polls.

In Section 8.7, will learn how to *approximate* this using normal curve.

Binomial example you can try: Online ESP test:

<http://www.gotpsi.org>

Try doing 5 guesses where there are 5 choices each time.

Assuming no ESP, $n = 5$ and $p = 1/5$ or $.2$.

What should be expected by chance?

$X =$ number correct, $E(X) = np = (5)(1/5) = 1$.

PDF is $P(X = k)$, CDF is $P(X \leq k)$

Also interesting to find $P(X \geq k)$

| k | pdf | cdf | $P(X \geq k)$ |
|-----|---------|---------|---------------|
| 0 | 0.32768 | 0.32768 | 1.00000 |
| 1 | 0.40960 | 0.73728 | 0.67232 |
| 2 | 0.20480 | 0.94208 | 0.26272 |
| 3 | 0.05120 | 0.99328 | 0.05792 |
| 4 | 0.00640 | 0.99968 | 0.00672 |
| 5 | 0.00032 | 1.00000 | 0.00032 |