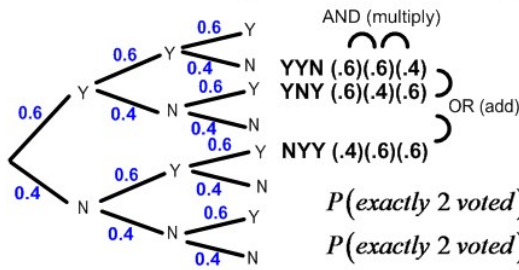


AP Statistics – Lesson Notes - Chapter 17: Probability Models

Bernoulli Trials and the Binomial Probability Model

At a college, 60% of the students voted in the latest election. If you select 3 students at random, what is the probability that exactly 2 voted in the election?



$$P(\text{exactly 2 voted}) = P(YYN) + P(YNY) + P(NYY)$$

$$P(\text{exactly 2 voted}) = (.6)(.6)(.4) + (.6)(.4)(.6) + (.4)(.6)(.6)$$

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$$P(\text{exactly 2 voted}) = 3(.6)^2(.4)^1$$

$$P(\text{exactly 2 voted}) = {}_3C_2 (P(\text{voted}))^2 (P(\text{didn't vote}))^1$$

number of ways the 2 students who voted can be chosen



Situations like this are called Bernoulli Trials

multiple trials, all independent
probability is constant
each trial only two options: "success" (voted), "failure" (did not vote)

If we are running a **fixed number of trials** (here, 3 students)
the probability answer is always in the form...

$$P(\text{exactly 2 voted}) = {}_3C_2 (P(\text{voted}))^2 (P(\text{didn't vote}))^1$$

...which looks like a term from a binomial theorem expansion, so this model is called the **Binomial probability model**. More generally:

$$P(\text{exactly } k \text{ successes}) = {}_n C_k (p)^k (q)^{n-k}$$

where n = number of trials

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We use this model so often that there is a calculator function dedicated to it:

$$\text{binompdf}(n, p, k)$$

Slightly different problem:

At a college, 60% of the students voted in the latest election. If you select 3 students at random, what is the probability that up to 2 voted in the election?

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0 voted 1 voted 2 voted 3 voted

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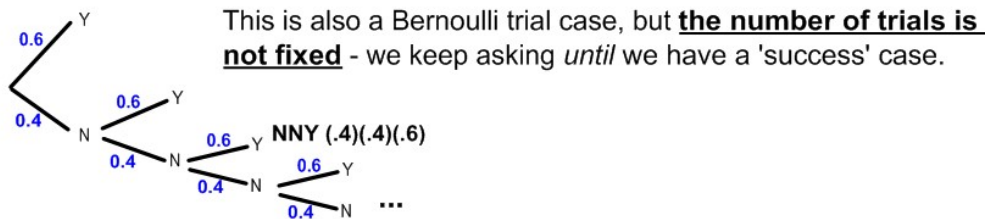
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Another variation:

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Bernoulli Trials and the Geometric Probability Model

At a college, 60% of the students voted in the latest election. If you keep asking students until you find one that voted, what is the probability that you have to ask exactly 3 students in order to find one that voted?



The results is in the form $P(\text{exactly } k \text{ successes}) = (q)^{k-1} (p)$ and this is called the Geometric probability model.

Like the binomial model, there are calculator functions for computation:

$geometpdf(p, k)$ probability that 1st success is on the k^{th} trial

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Bernoulli Trials

Compare these three scenarios...

A) If you draw two cards from a deck, what is the probability they are kings?

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The shape, mean, standard deviation of the Geometric Distribution

The Geometric distribution is a distribution so it has a shape which has a mean and standard deviation.

$$p = 0.2$$

$$\text{geompdf}(0.2,1) = .200$$

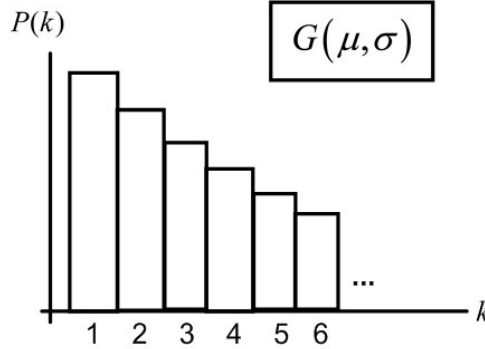
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(Math box (p.388) has an interesting derivation for the mean.)

$$\mu = \frac{1}{p} \quad \sigma = \sqrt{\frac{q}{p^2}}$$

The shape, mean, standard deviation of the Binomial Distribution

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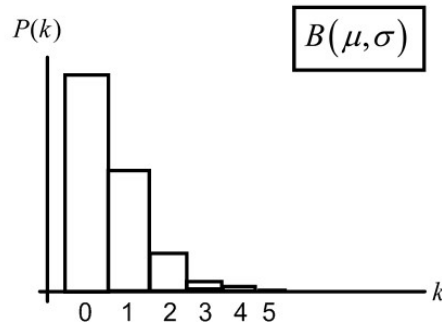
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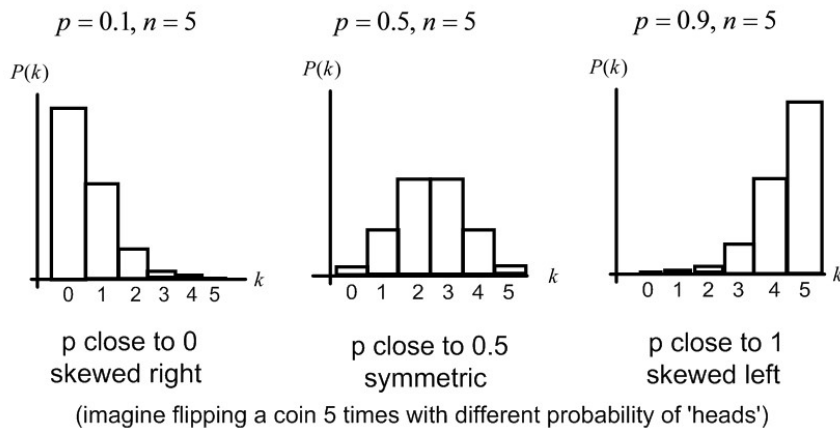


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$$\mu = np \quad \sigma = \sqrt{npq}$$

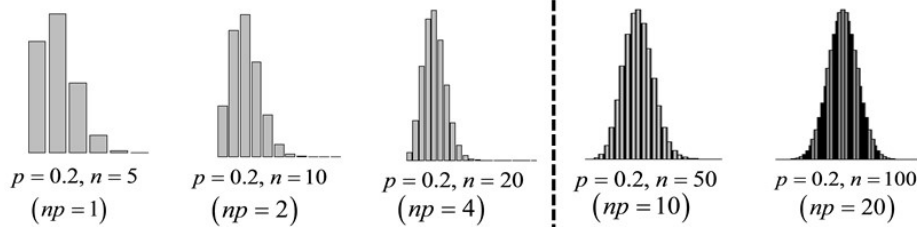
The shape of the Binomial Distribution - varying p

Changing the probability of success, p, changes the shape...



The shape of the Binomial Distribution - varying n

As the number of trials, n , increases, the shape of the Binomial distribution approaches the shape of a Normal distribution:



The "Success/Failure Condition"

If we expect at least 10 successes and 10 failures, we can use a Normal model to approximate the Binomial model.

If $np \geq 10$ and $nq \geq 10$

the Binomial model is approximately Normal.

(Math box (p.395) explains this condition in more detail.)

(see practice packet for examples of approximating a Binomial distribution with a Normal model)

Summary of probability models

Binomial Model (Bernoulli trials) Setting

$$\mu = np$$

$$\sigma = \sqrt{npq}$$

- 1) Only 2 outcomes (success/failure)
- 2) p does not change
- 3) Trials are independent
- 4) **Fixed** number of trials

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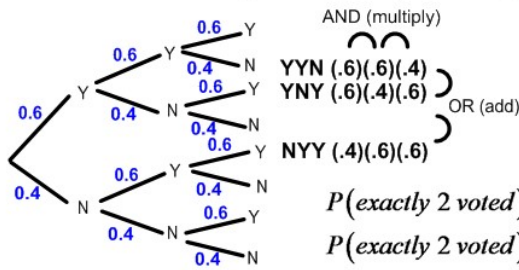
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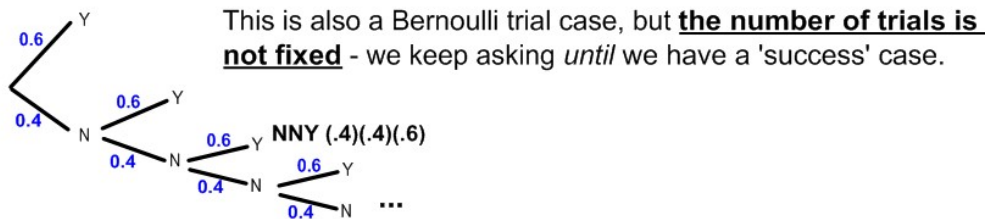
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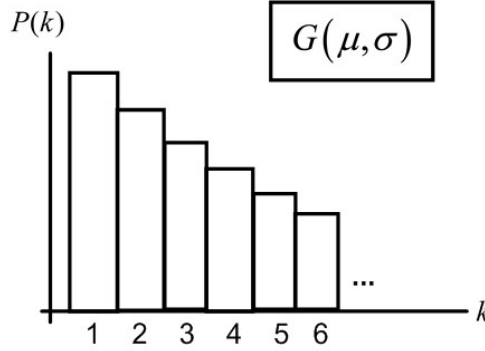
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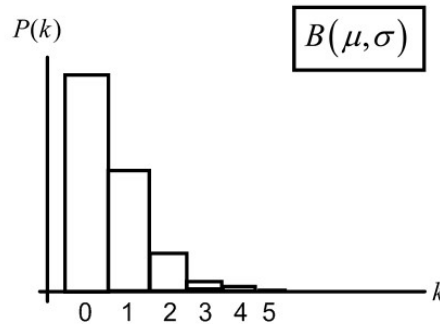
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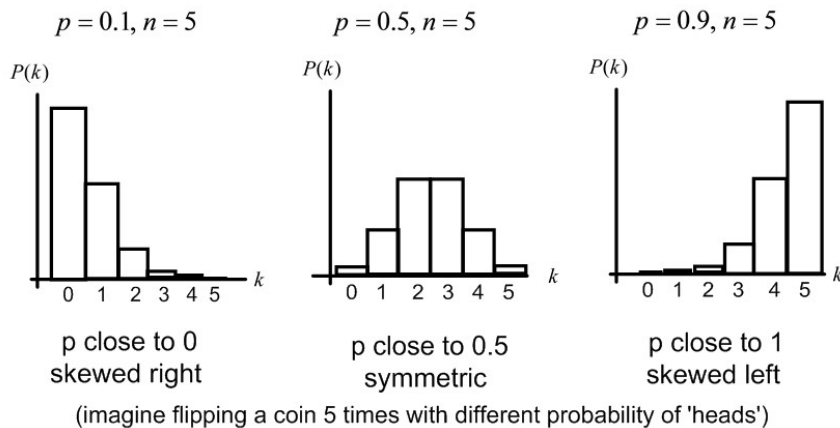


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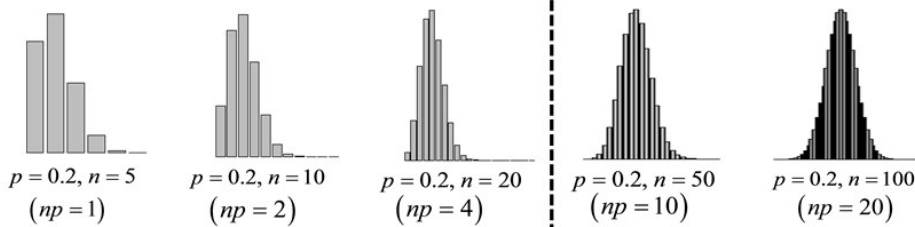
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