

Recitation Assignment due 2-9-10 in recitation.  
 Lecture 2-8-10 will be based on this assignment as will part of 2-10-10.  
 Part of lecture 2-10-10 will transition to chapter 19.

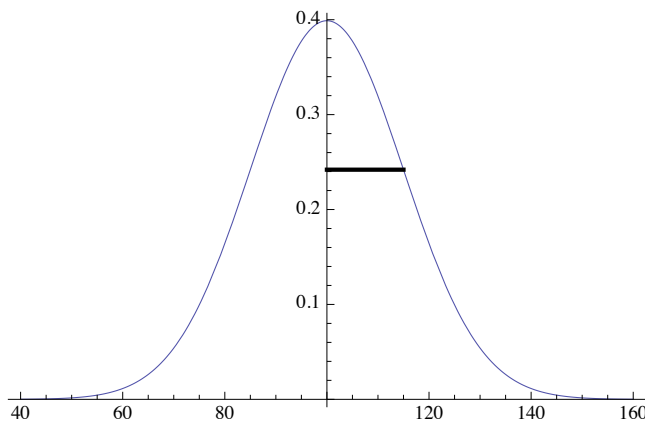
**Central Limit theorems.** The *Central Limit Theorem* of probability and statistics comes in a simple version as well as more general and subtle versions. Each of these theorems gives conditions under which the distribution of a sum (or an average) of random variables is approximately normal (bell curve).

**What are normal distributions?** Normal distributions are not mere bell shaped forms but are mathematically defined ideals towards which the distributions of sums of randomness progress if appropriate conditions are met.

Definition of a normal distribution having mean "mu" (written  $\mu$ ) and standard deviation "sigma" (written  $\sigma$ ):

$$(A) \quad p(x) = \frac{1}{\sigma\sqrt{2\pi}} e^{-\frac{(x-\mu)^2}{2\sigma^2}} \text{ for all values } -\infty < x < \infty.$$

Here is the plot of  $p(x)$  for an IQ distribution having  $\mu = 100$  and  $\sigma = 15$ . I've plotted it for  $x$  between 100-60 and 100+60, which is  $4\sigma$  either side of  $\mu = 100$ :



1. In the above plot of the idealized normal distribution for IQ identify  $\mu$  and  $\sigma$  and label them with their Greek symbols as well as their numerical values.

2. Regardless of the mean  $\mu$  and sd  $\sigma$ , the area under (A) is one. If random variable  $X$  has the normal distribution with some mean  $\mu$  and sd  $\sigma > 0$  then the random variable  $Z = \frac{X-\mu}{\sigma}$  (called the "standard score" of  $X$ ) has the normal distribution with mean 0 and standard deviation 1. So "all normal distributions are alike in standard deviation units from the mean." The main relations are:

$$z = \frac{x - \mu}{\sigma} \quad \text{and} \quad x = \mu + \sigma z.$$

A way to think is "z-score of x is the number of  $\sigma$  units (pos or neg) by which x is removed from  $\mu$ ."

- If IQ is normal distributed with mean 100 and sd 15 what is the standard score z of a person whose IQ is  $x = 115$ ?
- If IQ is normal distributed with mean 100 and sd 15 what is the standard score z of a person whose IQ is  $x = 100$ ?
- If IQ is normal distributed with mean 100 and sd 15 what is the standard score z of a person whose IQ is  $x = 130$ ?
- If IQ is normal distributed with mean 100 and sd 15 what is the IQ score x of a person whose standard score of IQ is  $z = 1$ ?
- If IQ is normal distributed with mean 100 and sd 15 what is the IQ score x of a person whose standard score of IQ is  $z = -2$ ?

3. Properties expressed in #2 have the consequence that if random variable X has a normal distribution with mean  $\mu$  and sd  $\sigma > 0$  then for every interval [a, b] we have:

$$P(X \text{ falls in } [a, b]) = P(Z \text{ defined by } \frac{X - \mu}{\sigma} \text{ falls in } [\frac{a - \mu}{\sigma}, \frac{b - \mu}{\sigma}]).$$

For example,

$$P(\text{IQ falls in } [100, 115]) = P(Z \text{ falls in } [0, 1]) = 0.34.$$

We soon will learn to use the "z-table" of areas captured by the standard normal Z. For now just concentrate on the interplay between X, Z and the "rule of thumb" of 68% and 95%.

- $P(\text{IQ} > 130) = P(Z > \quad) \sim$
- $P(85 < \text{IQ} < 115) = P(\quad < Z < \quad) \sim$
- $P(|\text{IQ} - 100| < 15) = P(|Z| < \quad) \sim$

d.  $P(\text{IQ} < \quad) = P(Z < 0) =$

e.  $P(\quad < \text{IQ} < \quad) = P(-2 < Z < 1) =$

f. We will find in the "z-table" that  $P(Z > 3.09) \sim 0.001$ . So  
 $P(\text{IQ} > \quad) = P(Z > 3.09) \sim$

g.  $P(|\text{IQ} - 100| < \quad) = P(|Z| < 3.09) \sim$

h.  $P(Z = 1.57889) = 0$  since it cannot exceed the area under the normal curve for any interval  $[1.57889 - \delta, 1.57889 + \delta]$  with  $\delta > 0$ . These areas shrink to zero as  $\delta$  is reduced towards zero. Likewise for every probability distribution on the real line whose probabilities are described by areas under a continuous curve we have the unusual consequence that every possible value  $x$  has zero probability. However, intervals having positive area between them and the curve will have positive probability. Sketch what is going on.

4. In chapter 18 there is a discussion of the normal approximation of the Binomial:

$X$  Binomial  $n, p \sim$  Normal with  $\mu = np$  and  $\sigma = \sqrt{npq}$   
 provided both of  $np$  and  $nq$  are at least 10.

Keep in mind that  $X$  counts the random "number of successes" in independent trials (such as the random number  $X$  of Democrat voters found in a random sample of  $n = 400$  voters). In the voting setup, as with many others, we are really interested in the sample fraction  $\hat{p} = \frac{X}{n}$ . For instance, if a total of  $x = 180$  vote Democrat in a random sample of  $n = 400$  then the **sample fraction** of Democrat voters is calculated  $\hat{p} = \frac{X}{n} = \frac{180}{400} = 0.45$ . By the properties of  $E$  and  $sd$  dividing by the constant  $n$  in changing from  $X$  to  $\hat{p}$  produces a normal distribution for  $\hat{p}$  with:

$$E \hat{p} = \frac{EX}{n} = \frac{np}{n} = p \quad \text{and} \quad sd \hat{p} = \frac{sd X}{n} = \frac{\sqrt{npq}}{n} = \sqrt{\frac{pq}{n}}.$$

Let's play "what if." Let us suppose that a population of voters might have fraction  $p = 0.53$  who favor a ballot proposal. If so, and we sample  $n = 400$  voters at random (with-replacement), what is

the approximate distribution of  $\hat{p}$ ? It will be normal with mean  $\mu = p = 0.53$  and sd  $\sigma = \sqrt{\frac{0.53 \times 0.47}{400}}$ .

a. Sketch the distribution just above identifying the resulting mean and sd as recognizable elements of your sketch. Verify that the "at least 10" conditions are met.

b. Give the 95% interval for  $\hat{p}$  in (a).

$$\begin{aligned} \text{c. } P(\hat{p} > 0.607111) &\sim P\left(Z > \frac{0.607111 - \mu}{\sigma}\right) \\ &= P\left(Z > \frac{0.607111 - p}{\sqrt{\frac{pq}{n}}}\right) = P\left(Z > \frac{0.607111 - 0.53}{\sqrt{\frac{0.53 \cdot 0.47}{400}}}\right) = \end{aligned}$$

5. Similar to #4.

a. Sketch the approximate normal distribution of  $\hat{p}$  = the sample fraction of Democrat voters in a random (with replacement) sample of 30 voters from a population in which the fraction  $p = 0.55$  are Democrat. Identify the mean and sd as recognizable elements of your sketch. Verify that the "at least 10" conditions are met.

b. Give the 95% interval for  $\hat{p}$  in (a).

$$\text{c. } P(\hat{p} > 0.731659) \sim P(Z > \quad) =$$

d. Probability we call the election wrong when  $p = 0.55$  and  $n = 30$  is

$$P(\hat{p} < 0.5) \sim P(Z < \quad)$$

(requires z-table to evaluate, we will do it later on)