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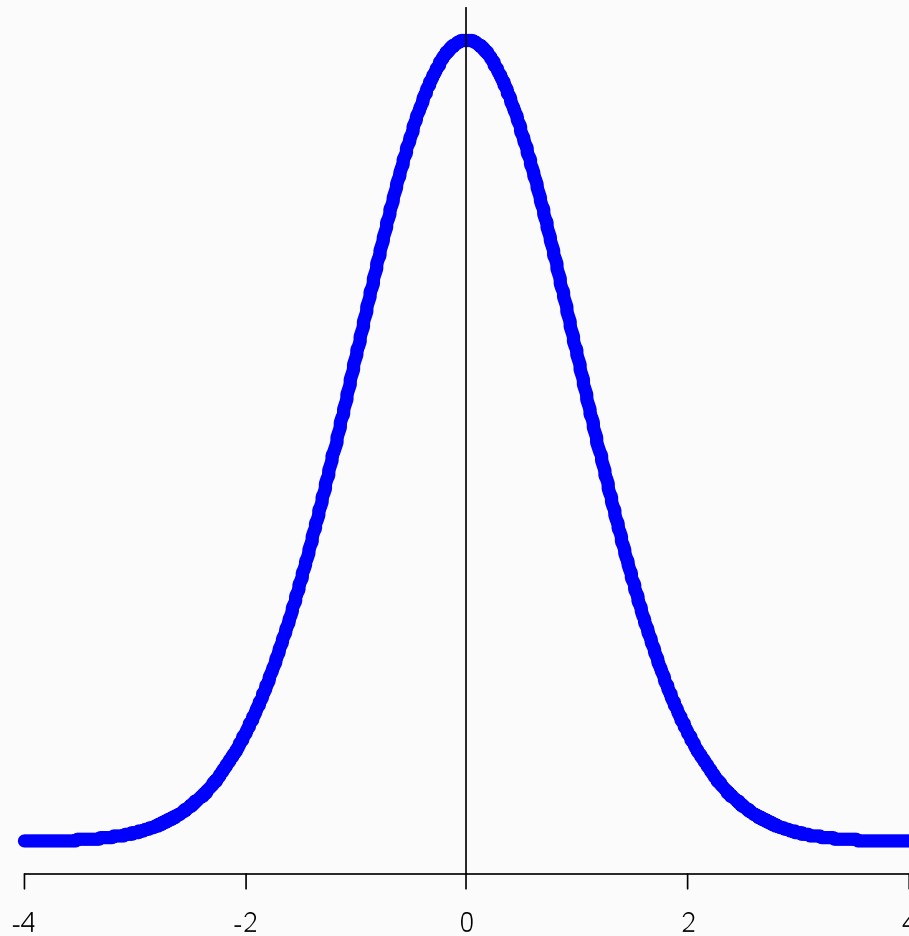
JOHNS HOPKINS
BLOOMBERG
SCHOOL *of* PUBLIC HEALTH

Section B

Variability in the Normal Distribution: Calculating Normal Scores

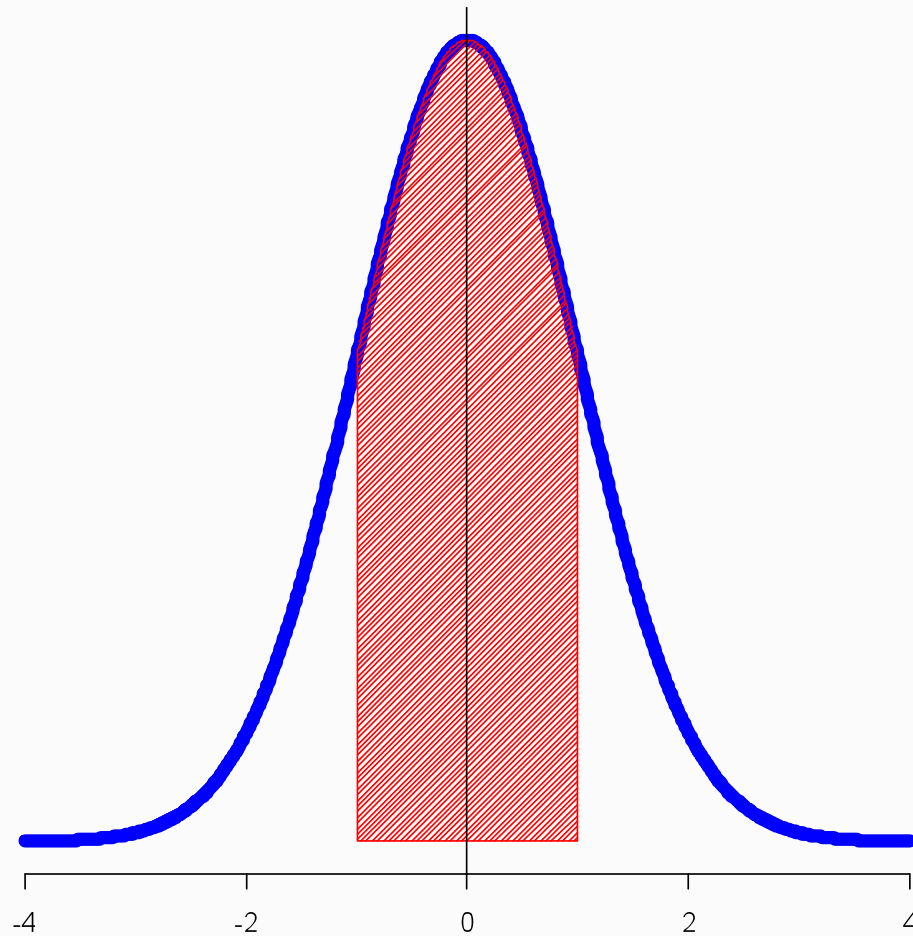
The Standard Normal Distribution

- The standard normal distribution has a mean of 0, and standard deviation of 1



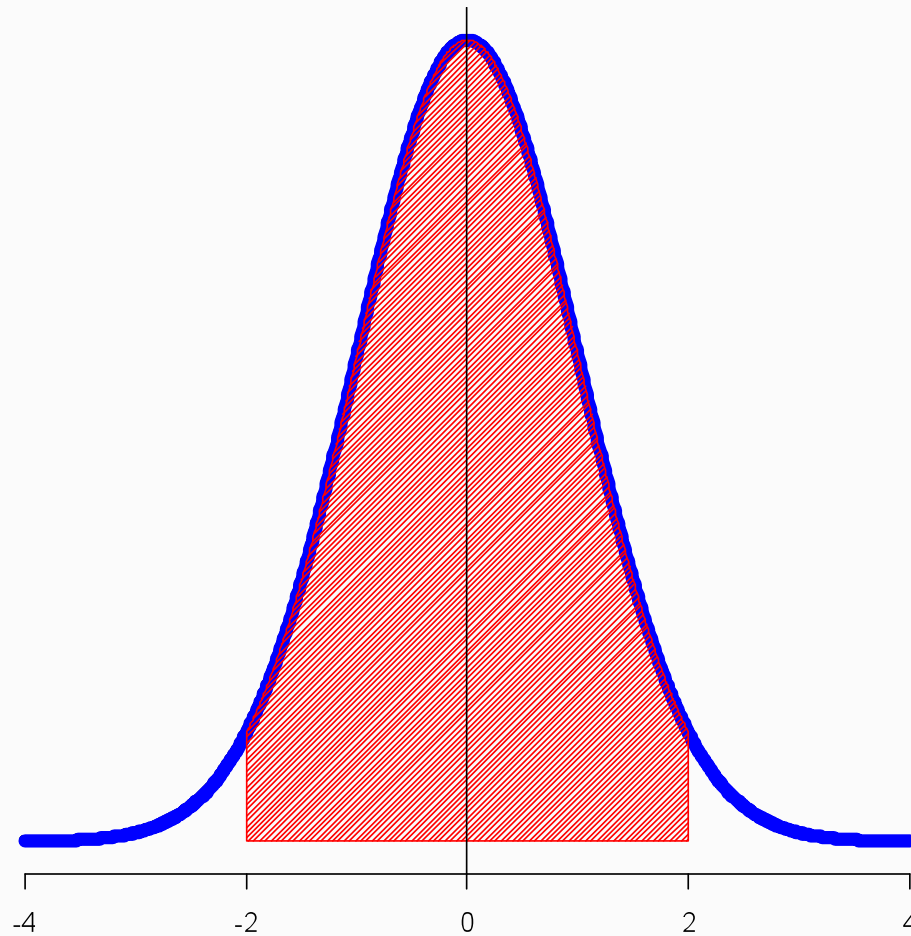
The 68-95-99.7 Rule for the Normal Distribution

- 68% of the observations fall within one standard deviation of the mean



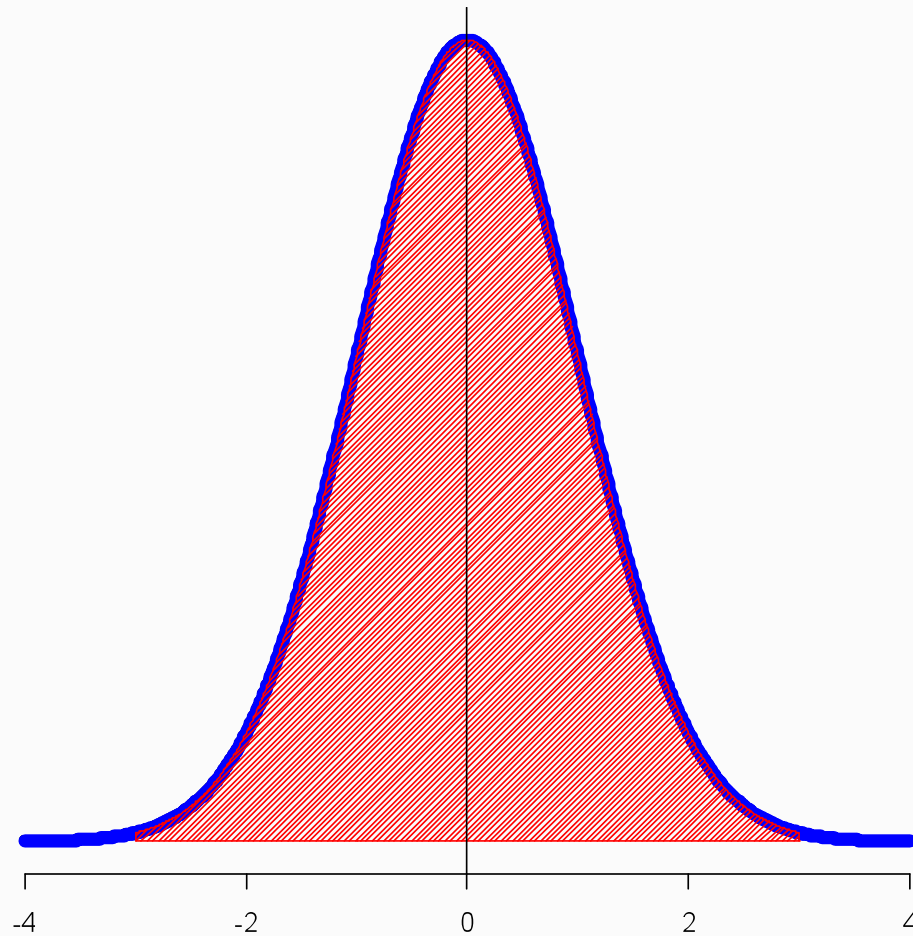
The 68-95-99.7 Rule for the Normal Distribution

- 95% of the observations fall within two standard deviations of the mean (truthfully, within 1.96)

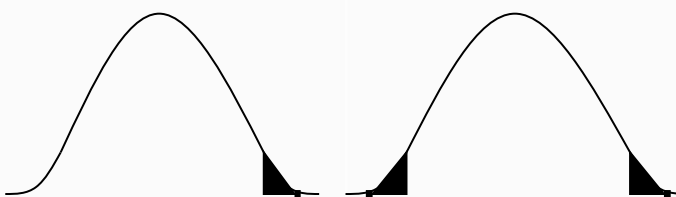


The 68-95-99.7 Rule for the Normal Distribution

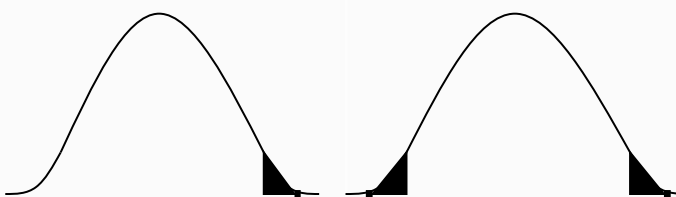
- 99.7% of the observations fall within three standard deviations of the mean



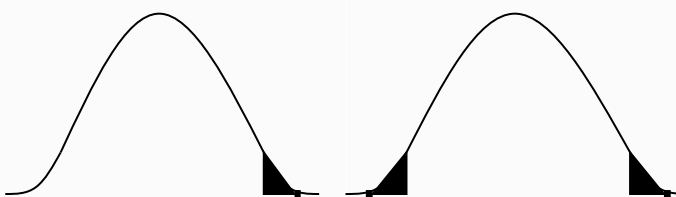
Fraction of Observations under Standard Normal

| Z | Within Z SDs of the mean | More than Z SDs above the mean | More than Z SDs above or below the mean |
|-----|--------------------------|---|---|
| Z | |  | |
| 1.0 | 68.27% | 15.87% | 31.73% |
| 2.0 | 95.45% | 2.28% | 4.55% |
| 2.5 | 98.76% | 0.62% | 1.24% |
| 3.0 | 99.73% | 0.13% | 0.27% |

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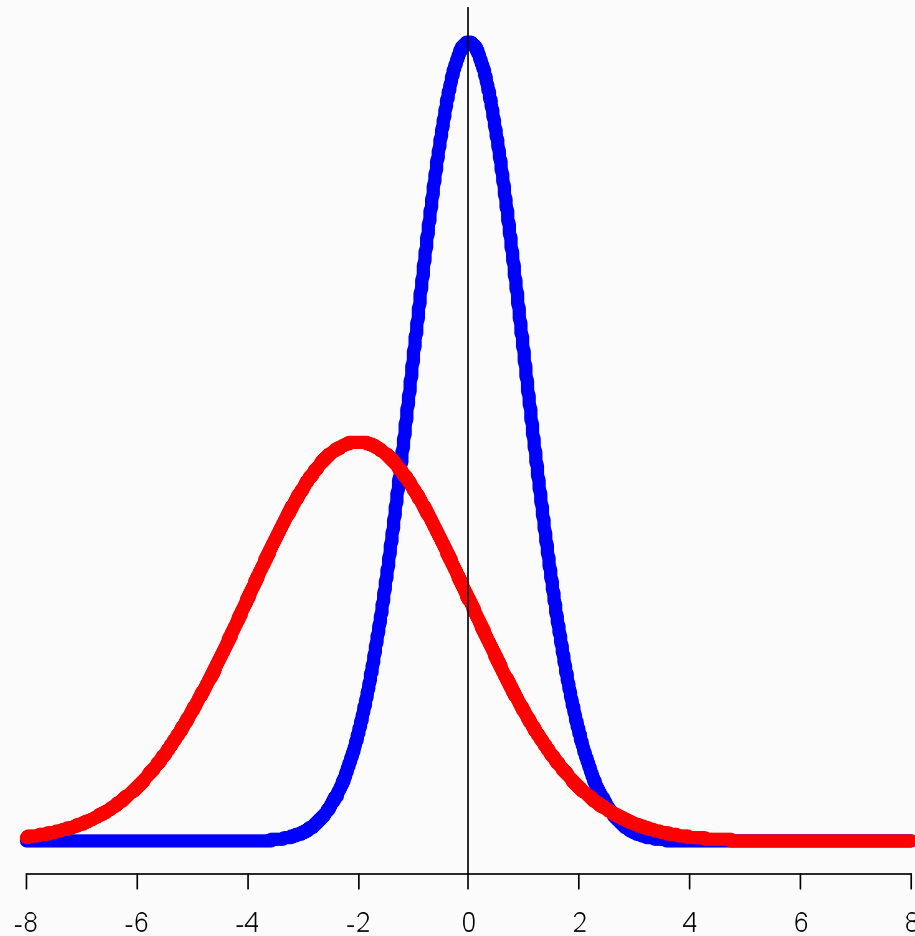
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The 68-95-99.7 Rule for the Normal Distribution

- What about other normal distributions with other means and standard deviations?
- Same exact properties apply
- In fact, any normal distribution with any mean and standard deviation can be transformed to a standard normal curve

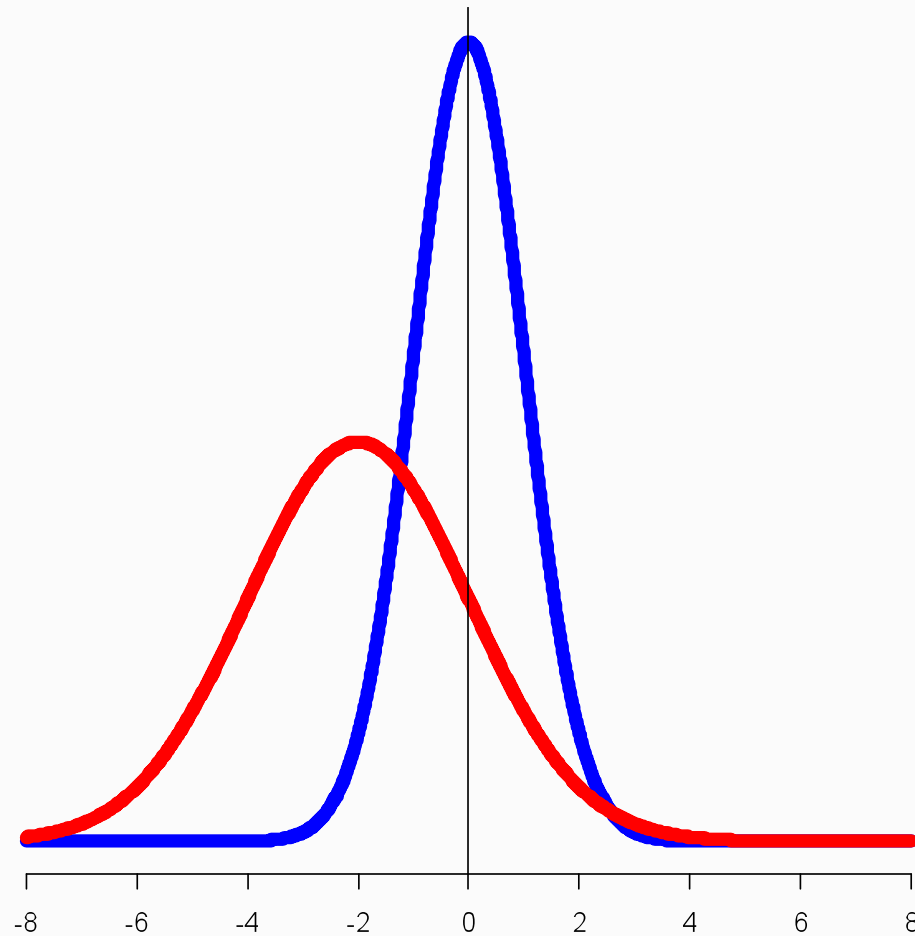
Transforming to Standard Normal

- The standard normal curve (blue) and another normal with mean -2, and standard deviation 2



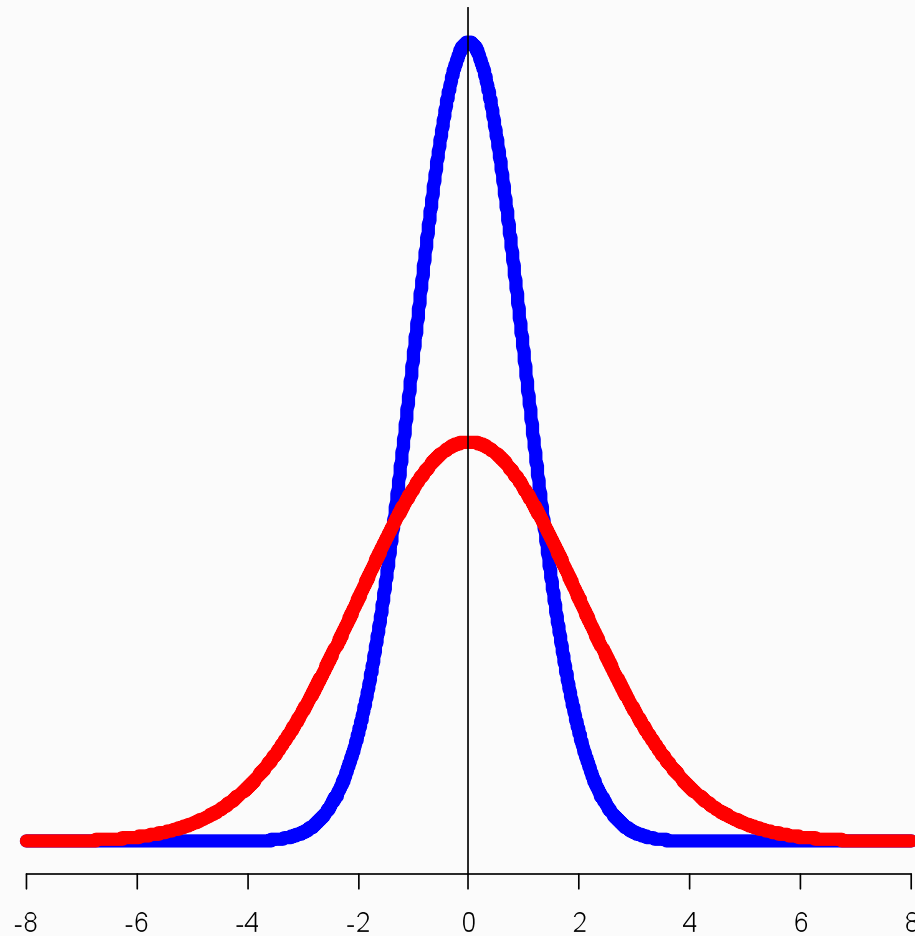
Transforming to Standard Normal

- To center at zero, subtract of mean of -2 from each observation under the red curve



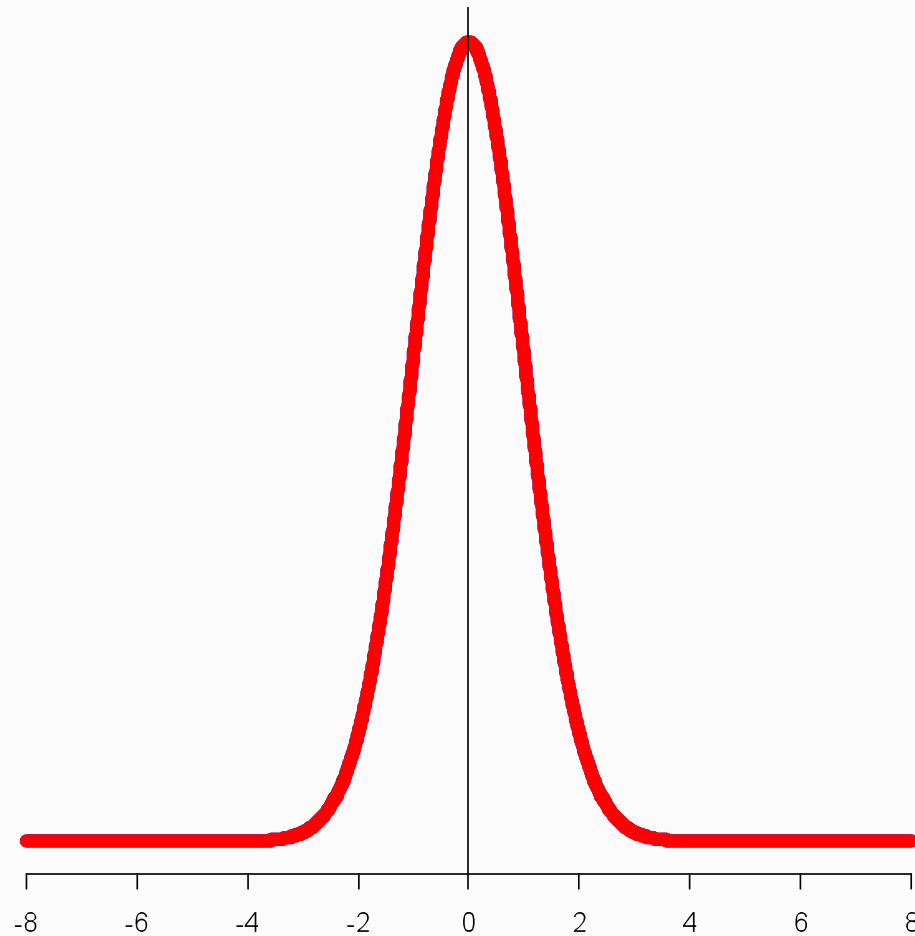
Transforming to Standard Normal

- To “change shape” (i.e., change spread; i.e., standard deviation) divide each “new observation” by standard deviation of 2



Transforming to Standard Normal

- To “change shape” (i.e., change spread; i.e., standard deviation) divide each “new observation” by standard deviation of 2

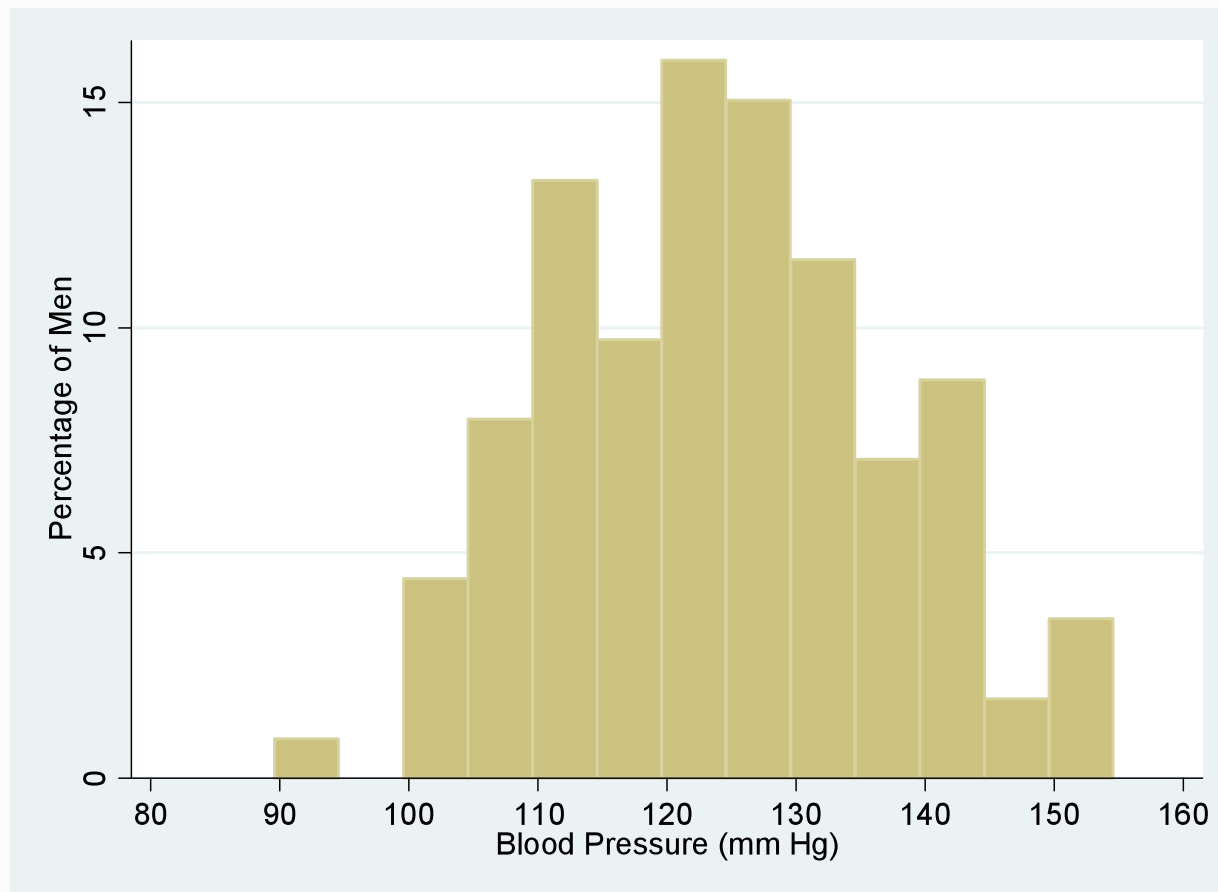


Transforming to Standard Normal

- This process is called standardizing or computing z-scores
- A z-score can be computed for any observation from any normal curve
- A z-score measures the distance of any observation from its distribution's mean in units of standard deviation
- This z-score can help assess where the observations fall relative to the rest of the observations in the distribution
- z-score computed by: $z = \frac{\textit{observation} - \textit{mean}}{\textit{standard deviation}}$

Example 1: Blood Pressure in Males

- Histogram of BP values for random sample of 113 men suggest BP measurements approximated by a normal distribution



Example 1: Blood Pressure in Males

■ Data in Stata

```
. list bp in 1/10  
  
+-----+  
| bp |  
+-----+  
1. | 89 |  
2. | 99 |  
3. | 101 |  
4. | 101 |  
5. | 103 |  
+-----+  
6. | 103 |  
7. | 104 |  
8. | 105 |  
9. | 106 |  
10. | 106 |  
+-----+
```

Example 1: Blood Pressure in Males

- Summarize command gives sample mean and standard deviation

```
. summarize bp
```

| Variable | Obs | Mean | Std. Dev. | Min | Max |
|-------------|-----|----------|-----------|-----|-----|
| -----+----- | | | | | |
| bp | 113 | 123.5929 | 12.86512 | 89 | 152 |

Example 1: Blood Pressure in Males

- Summarize command gives sample mean and standard deviation (and sample size, minimum and maximum values)

```
. summarize bp
```

| Variable | Obs | Mean | Std. Dev. | Min | Max |
|----------|-----|----------|-----------|-----|-----|
| bp | 113 | 123.5929 | 12.86512 | 89 | 152 |

$$\bar{x} = 123.6 \text{ mmHg}; s = 12.9 \text{ mmHg}$$

Example 1: Blood Pressure in Males

- Using the sample data, let's estimate the range of blood pressure values for “most” (95%) of men in the population
- For normally distributed data, 95% will fall within 2 sds of the mean

$$\bar{x} \pm 2s$$

$$123.6 \pm 2 \times 12.9$$

$$(97.8, 149.4)$$

- Again, this is just an estimate using the best guesses from the sample for mean and sd of the population

Example 1: Blood Pressure in Males

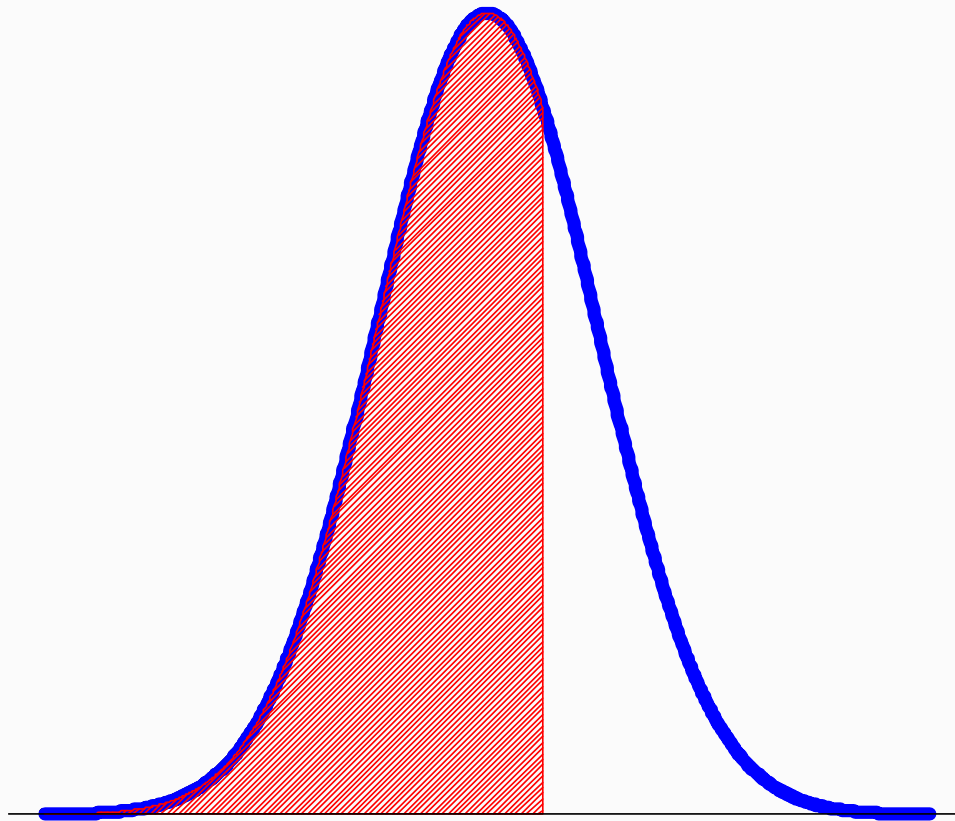
- Suppose a man comes into my clinic, gets his blood pressure measured, and wants to know how he compares to all men
- His blood pressure is 130 mmHg
- What percentage of men have blood pressures greater than 130 mmHg?
- Translate to z-score
$$z = \frac{130 - 123.6}{12.9} \approx 0.5$$
- Question akin to “what percentage of observations under a standard normal curve are 0.5 sds or more above the mean in value?”

Example 1: Blood Pressure in Males

- Could look this up in a normal table (more extensive tables can be found in the back of any stats book or by searching online)
- Could also use normal function in Stata

Example 1: Blood Pressure in Males

- Typing `display normal(z)` at command line gives proportion of observation less than z standard deviations from mean:

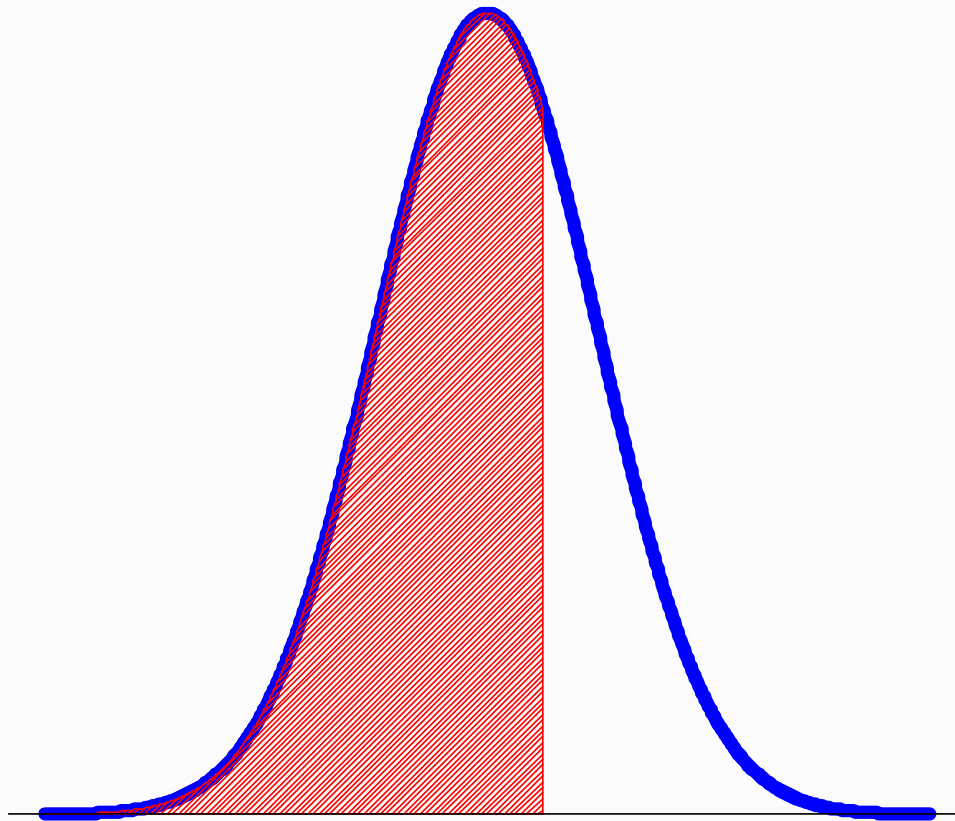


Example 1: Blood Pressure in Males

- For $z = 0.5$, roughly 69% percent of observations fall below .5 sds from mean

```
. display normal(.5)
```

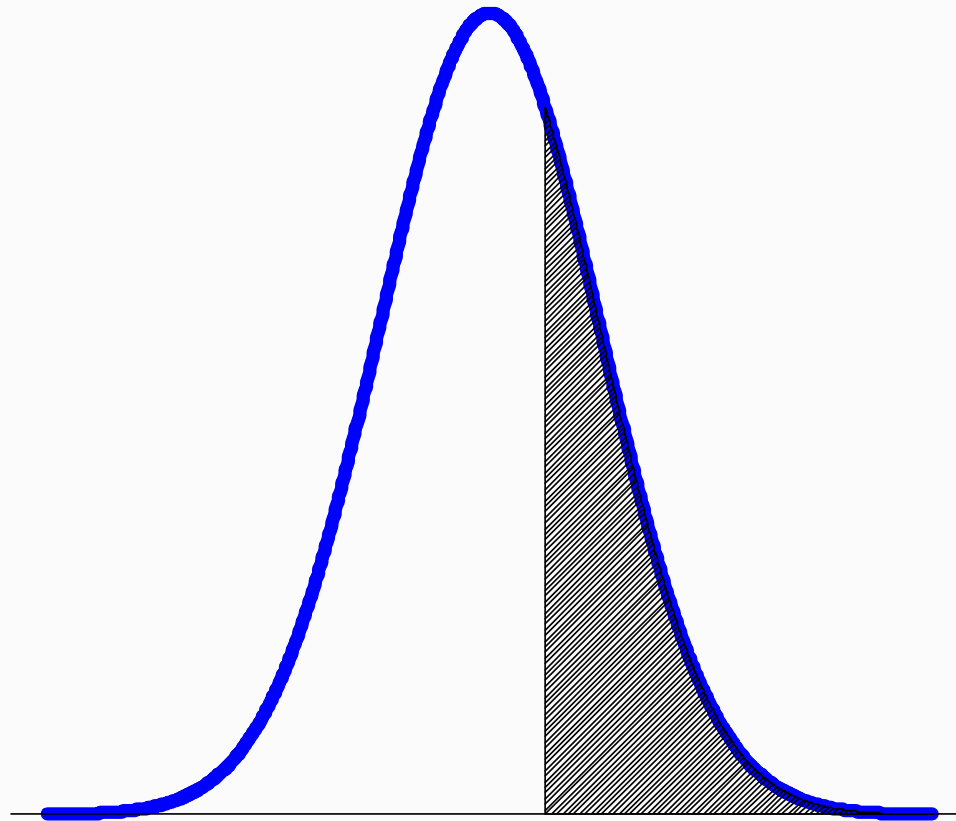
```
.69146246
```



Example 1: Blood Pressure in Males

- For $z = 0.5$, roughly $100\% - 69\% = 31\%$ of observations fall above .5 sds from mean

```
. display 1 - normal(.5)  
.30853754
```

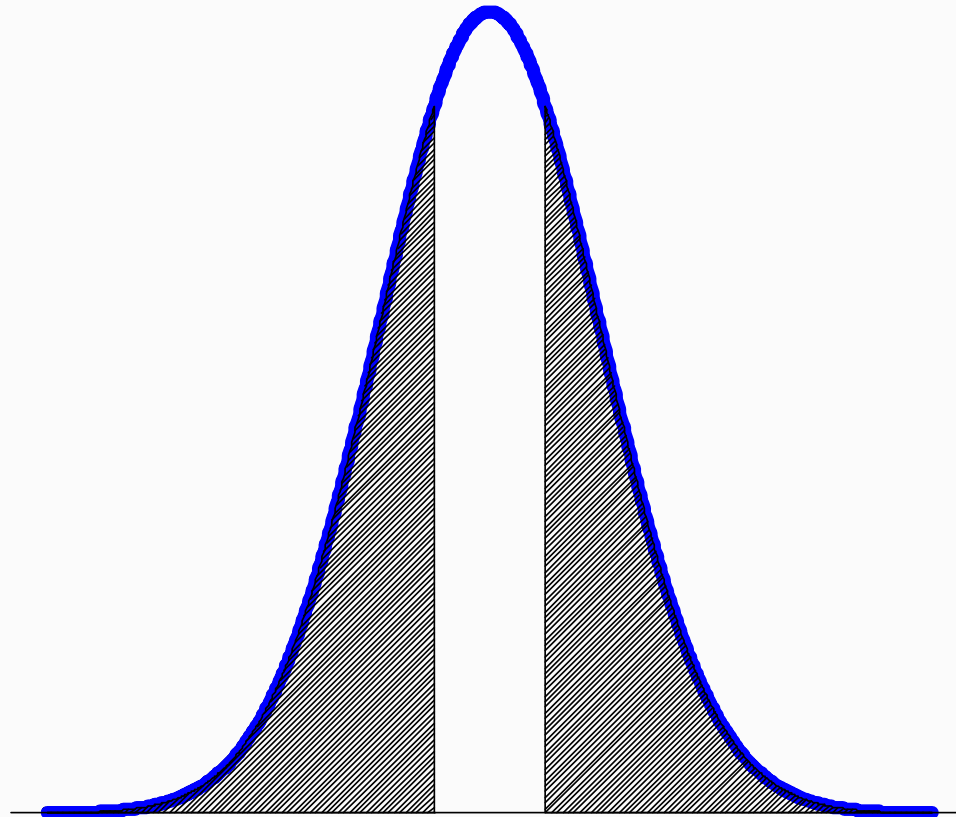


Example 1: Blood Pressure in Males

- So approximately 31% of all men have blood pressures greater than our subject with a blood pressure of 130
- What percentage of men have blood pressures more extreme, i.e. farther than .5 sds from the mean of all men in either direction?

Example 1: Blood Pressure in Males

- What we want



Example 1: Blood Pressure in Males

- By symmetry of normal curve, 31% of observations are above $.5$ sd, and 31% below $-.5$ sd
- So a total of 62% is farther than $.5$ sds from mean in either direction

