



FOUNDATIONS OF PROBABILITY IN R

Updating from evidence

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Data Scientist, Stack Overflow

20 flips of a coin



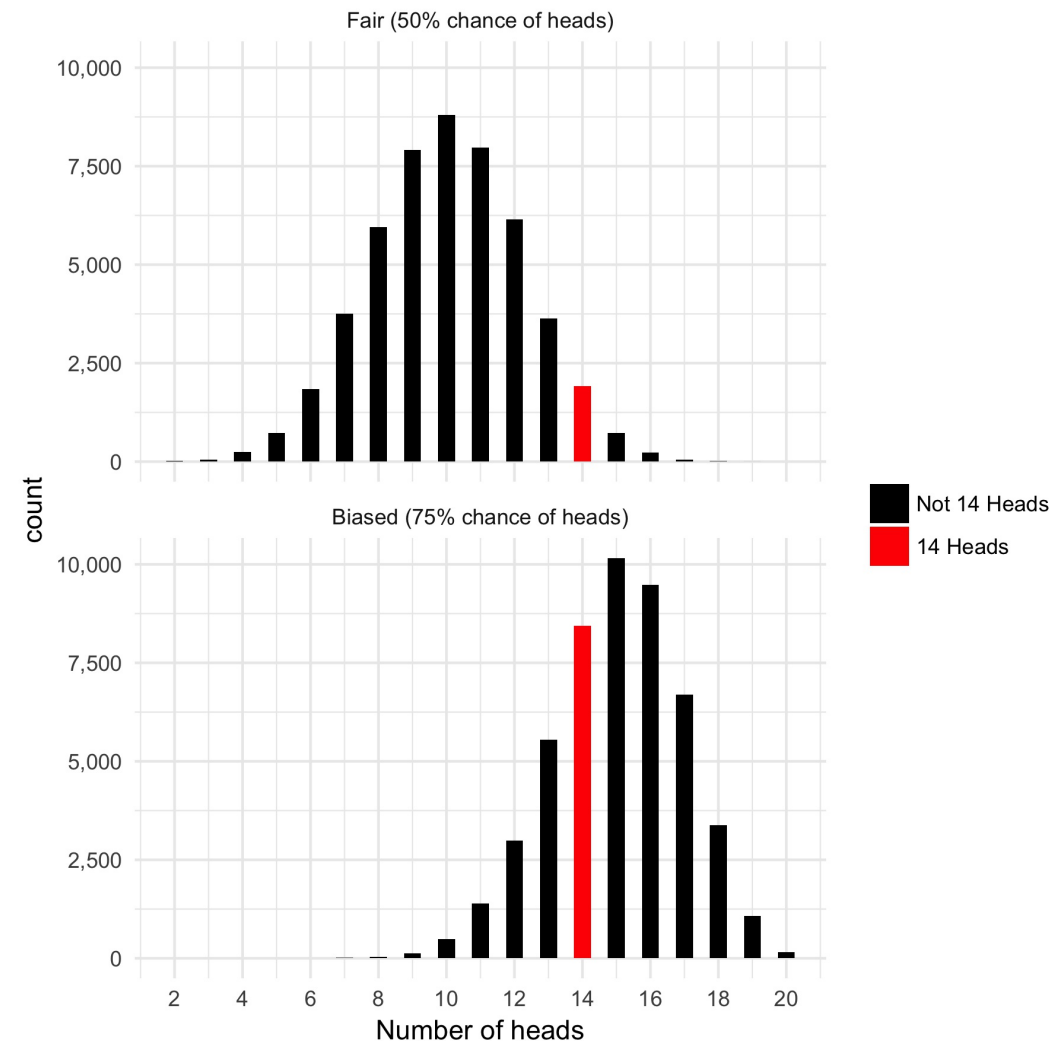
Two piles of 50,000 coins

```
fair <- rbinom(50000, 20, .5)
sum(fair == 14)
# 1888
```

```
biased <- rbinom(50000, 20, .75)
sum(biased == 14)
# 8372
```

```
1888 + 8372
# [1] 10260
```

$$\begin{aligned}\Pr(\text{Biased} | 14 \text{ Heads}) &= \frac{\# \text{ biased w/14 Heads}}{\# \text{ total w/14 Heads}} \\ &= \frac{8372}{1888 + 8372} = 82\%\end{aligned}$$





FOUNDATIONS OF PROBABILITY IN R

Let's practice!



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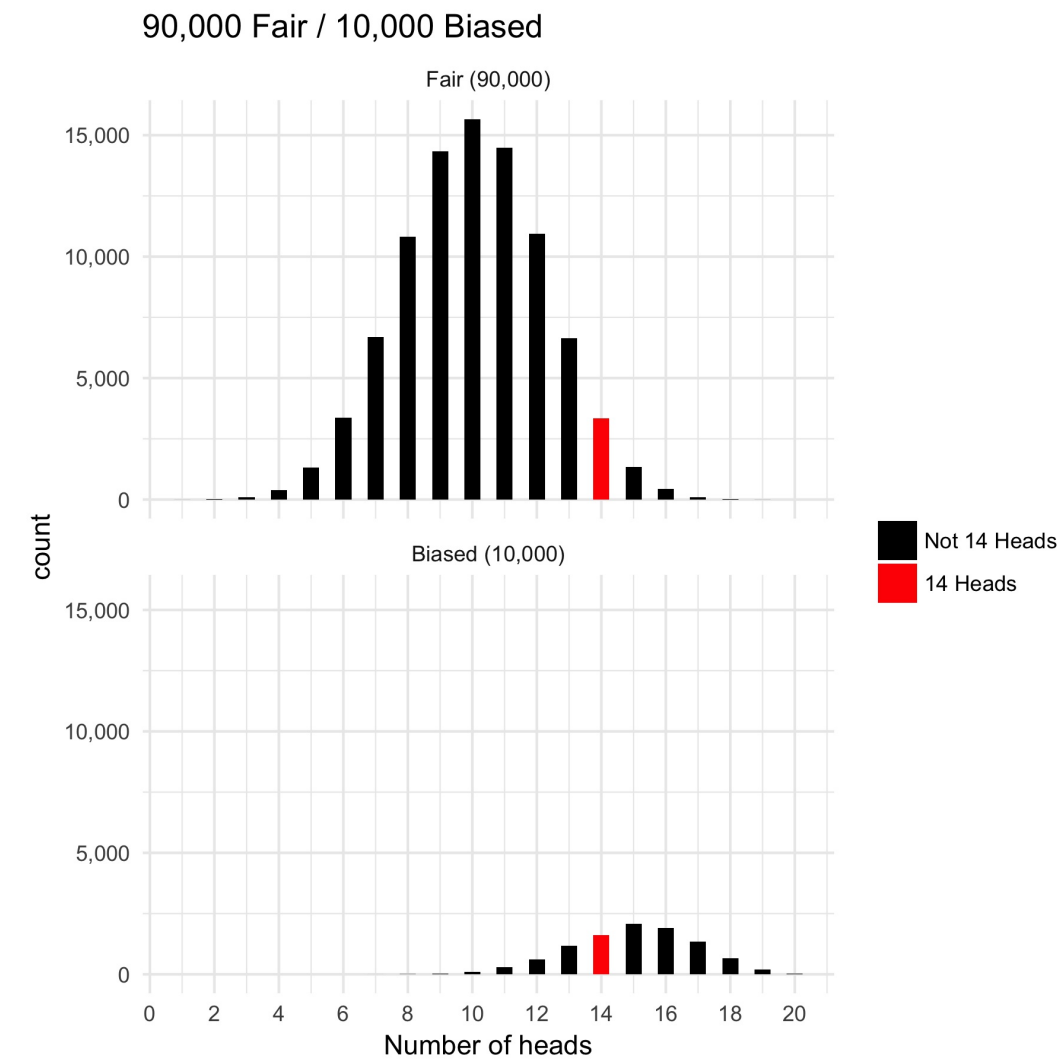
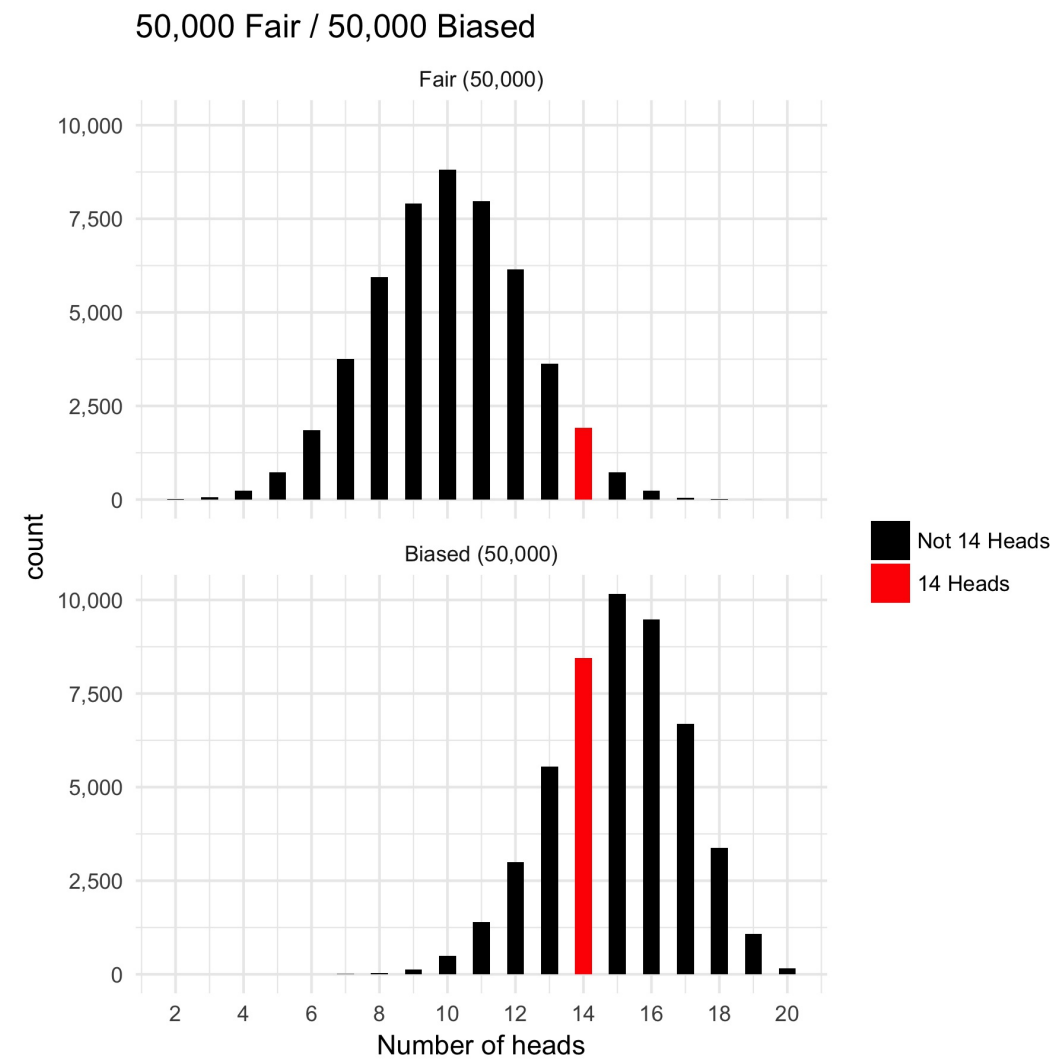
Prior probability

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Differently sized piles



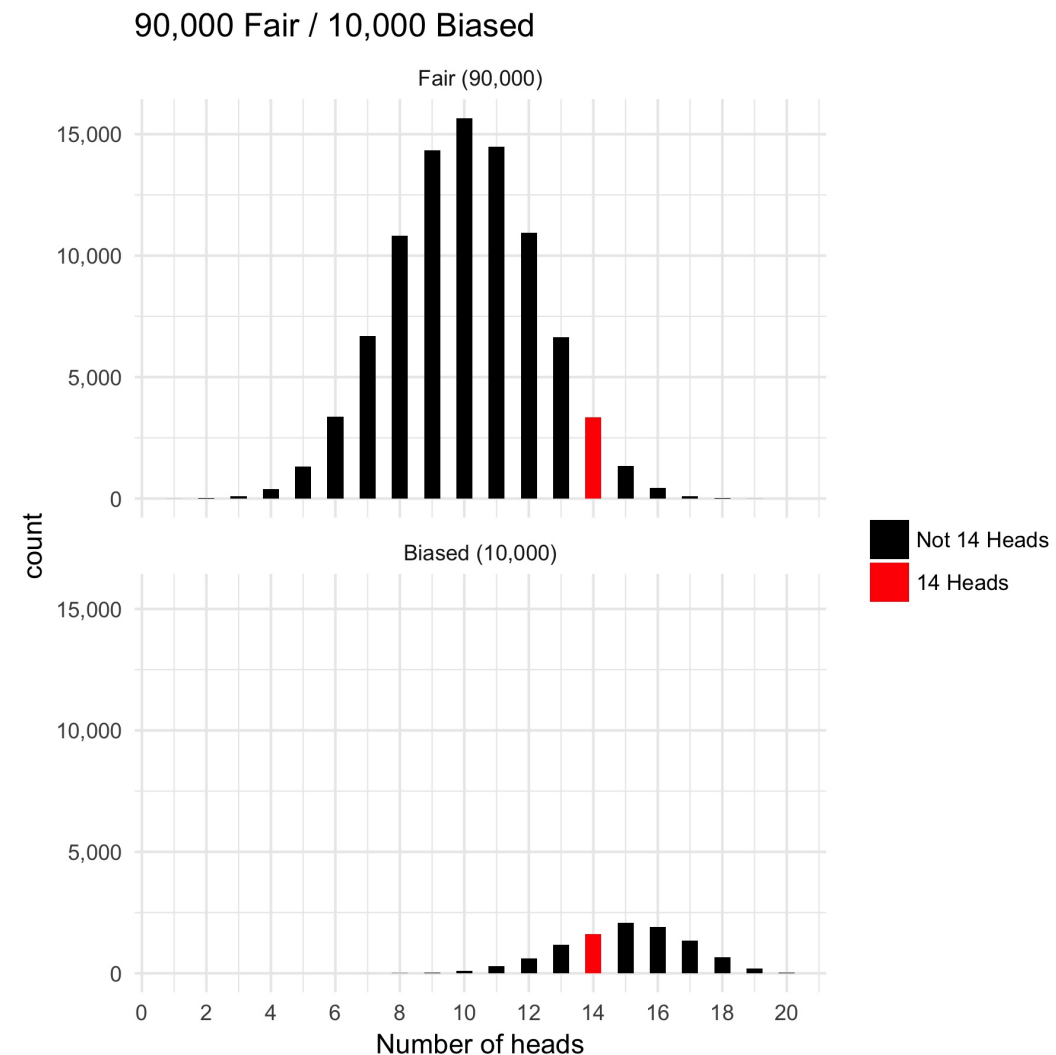
Simulating with differently sized piles

```
fair <- rbinom(90000, 20, .5)
sum(fair == 14)
# [1] 3410
```

```
biased <- rbinom(10000, 20, .75)
sum(biased == 14)
# [1] 1706
```

$$\frac{\text{\# of biased w/14 Heads}}{\text{\# total w/14 Heads}}$$

$$\frac{1706}{1706 + 3410} = .333$$





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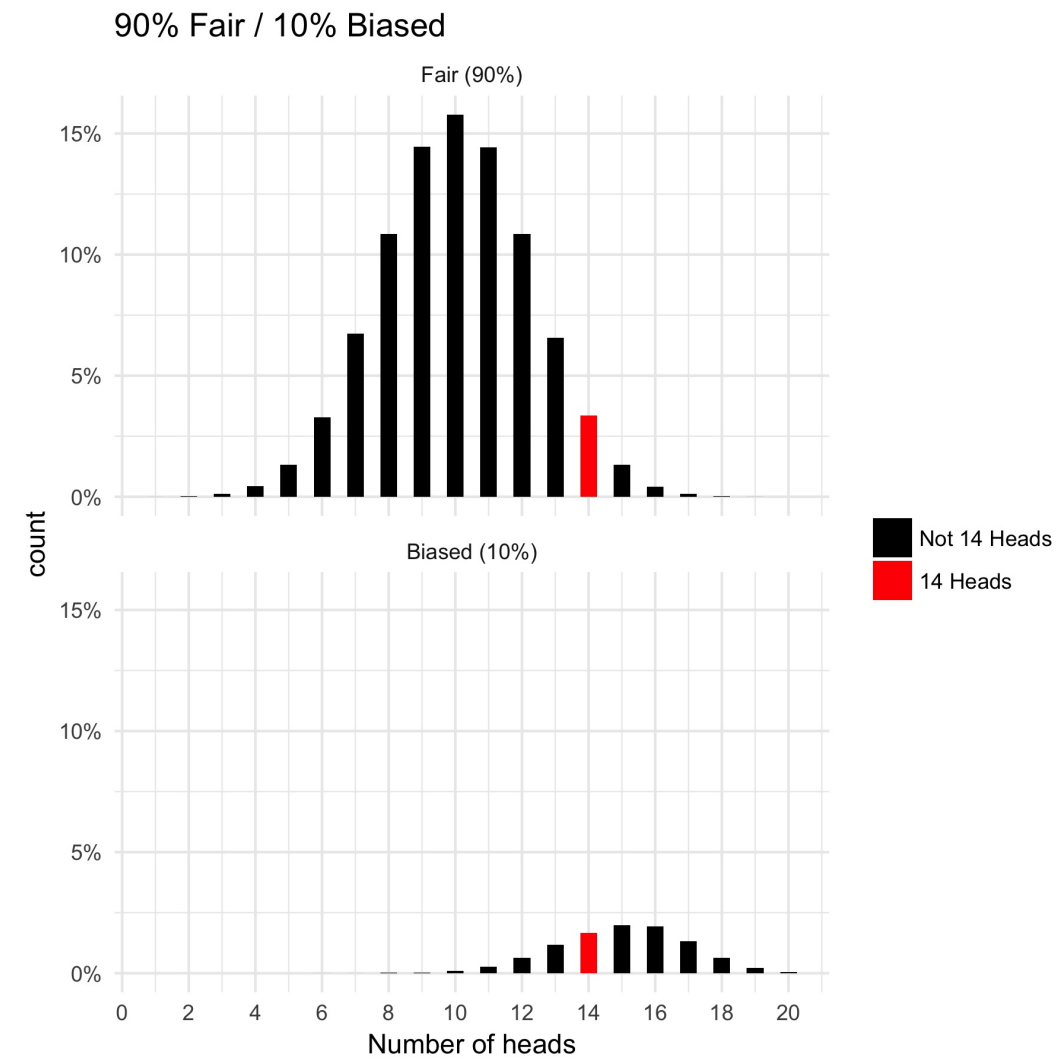
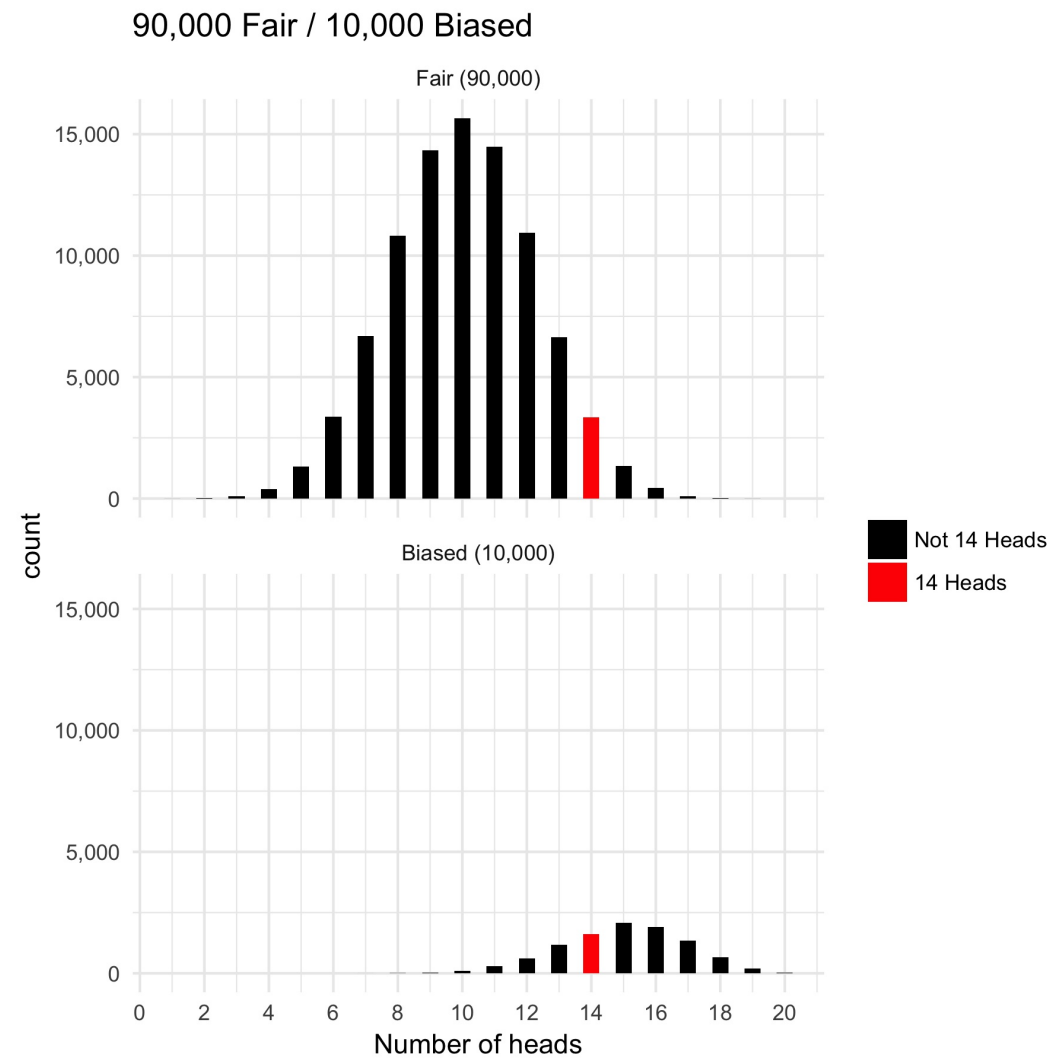
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Bayes' theorem

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Probabilities



Probability of fair coin with 14 heads

```
fair <- rbinom(90000, 20, .5)
sum(fair == 14)
# [1] 3410
```

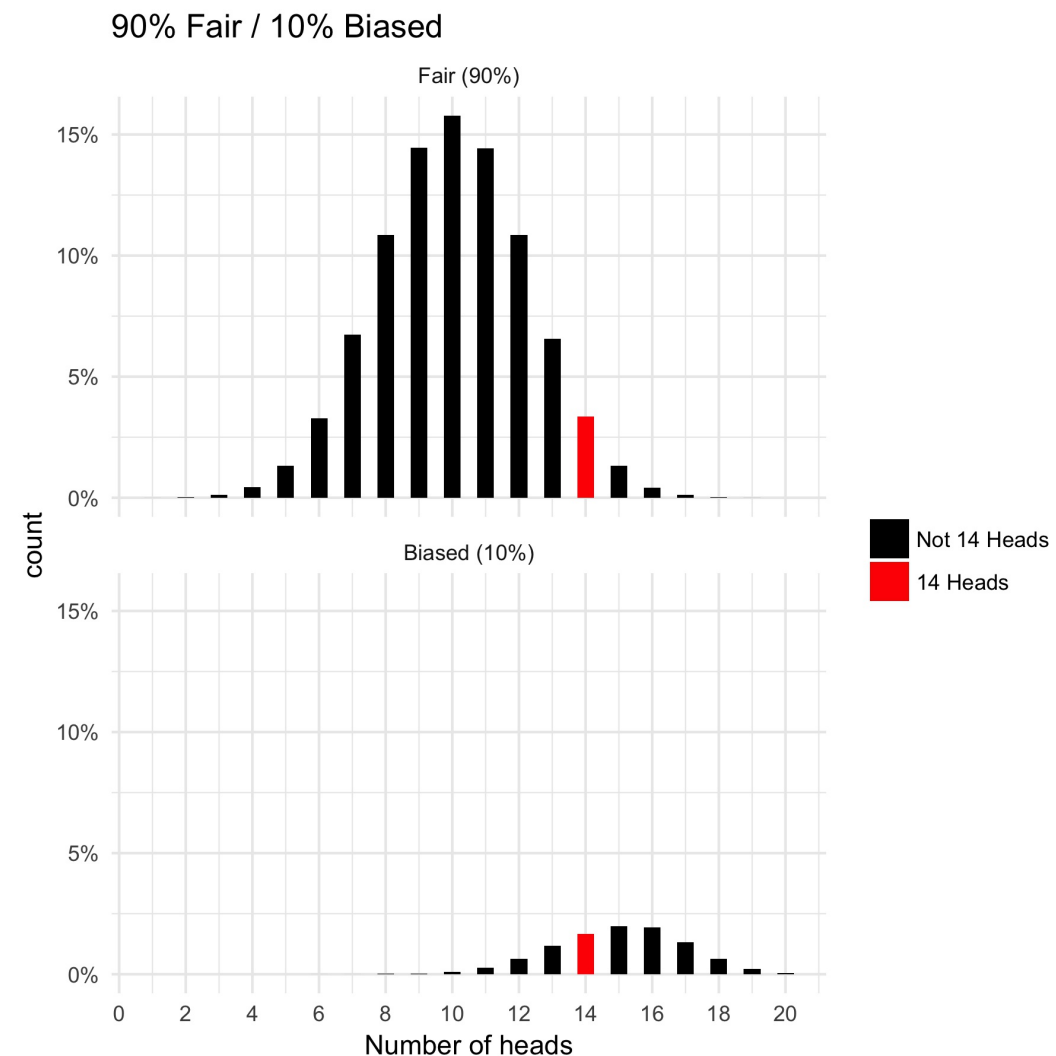
```
dbinom(14, 20, .5) * .9
# [1] 0.03326797
```

$$\Pr(14 \text{ Heads} | \text{Fair}) \cdot \Pr(\text{Fair})$$

```
biased <- rbinom(10000, 20, .75)
sum(biased == 14)
# [1] 1706
```

```
dbinom(14, 20, .75) * .1
# [1] 0.01686093
```

$$\Pr(14 \text{ Heads} | \text{Biased}) \cdot \Pr(\text{Biased})$$





Conditional probability

$$\begin{aligned}\Pr(\text{Biased} | 14 \text{ Heads}) &= \frac{\Pr(14 \text{ Heads and Biased})}{\Pr(14 \text{ Heads and Biased}) + \Pr(14 \text{ Heads and Fair})} \\ &= \frac{\Pr(14 \text{ Heads} | \text{Biased}) \Pr(\text{Biased})}{\Pr(14 \text{ Heads} | \text{Biased}) \Pr(\text{Biased}) + \Pr(14 \text{ Heads} | \text{Fair}) \Pr(\text{Fair})}\end{aligned}$$

```
prob_14_fair <- dbinom(14, 20, .5) * .9
prob_14_biased <- dbinom(14, 20, .75) * .1

prob_14_biased / (prob_14_fair + prob_14_biased)
```



Bayes' Theorem

$$\Pr(A|B) = \frac{\Pr(B|A) \Pr(A)}{\Pr(B|A) \Pr(A) + \Pr(B|\text{not } A) \Pr(\text{not } A)}$$

$A = \text{Biased}$

$B = 14 \text{ Heads}$



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