# Random Variables and the Binomial Distribution

(Highlights from Chapters 15 and 16)

#### Random Variables

- A random variable is a variable whose possible values are numerical outcomes of a random phenomenon. Use capital letters like X, Y, Z to denote random variables. Use lower case letters x, y, z to denote specific observed values.
- Example: X = number of times Paul the Octopus correctly predicts the winner of a World Cup Soccer/Football game in 8 attempts. He got x = 8 correct!



(image credit: Wolfgang Rattay/Reuters)

• **Example:** X = number of frogs in a sample of size 30 that have a certain genetic mutation. Maybe in a particular sample I observe x = 2.

#### **Binomial Distribution**

The **Binomial** distribution represents the distribution of a count of the number of "successes" in n trials

- The probability of success is the same on each trial: denote by lower case p
- The trials are independent

We use a short-hand notation to describe this:

- $X \sim \text{Binomial}(n, p)$ 
  - "X follows a Binomial distribution with n trials and probability of success p"

### Example in Detail: Paul the Octopus

Define X = the number of successful predictions in 8 attempts.

Suppose p = 0.8 (Paul's predictions are pretty good!)

We could use the model  $X \sim \text{Binomial}(8, 0.8)$ 

#### Calculations with the Binomial

• Suppose  $X \sim \text{Binomial}(8, 0.8)$ 

Define the following events (assumed to be independent):

 $A_1$ : Paul's 1st prediction is correct,  $A_2$ : Paul's 2nd prediction is correct, ...,  $A_8$ : Paul's 8th prediction is correct

a. What does the assumption that these events are independent actually mean?

b. What's the probability that Paul gets 8 out of 8 predictions correct?

dbinom(x = 8, size = 8, prob = 0.8)

## [1] 0.1677722

c. What's the probability that Paul gets the first 7 predictions correct and the last one wrong?

d. What's the probability that Paul gets 7 out of 8 predictions correct? (we're not specifying which one he got wrong – it could be the first, or the second, or the third, ..., or the eighth)

```
dbinom(x = 7, size = 8, prob = 0.8)
## [1] 0.3355443
```

e. What's the probabilty that Paul gets 5 or fewer predictions correct?

Just kidding! Let's not calculate that by hand.

```
pbinom(q = 5, size = 8, prob = 0.8)
## [1] 0.2030822
```

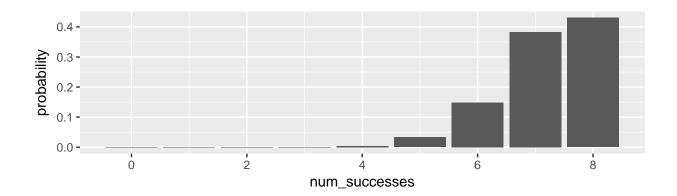
#### The Full Binomial Distribution

• We can use dbinom to calculate the probability of x successes for each possible x from 0 to 8:

```
Paul_success_probs <- data.frame(
  num_successes = seq(from = 0, to = 8),
  probability = dbinom(x = seq(from = 0, to = 8), size = 8, prob = 0.9))
Paul_success_probs

## num_successes probability
## 1</pre>
```

```
## 1
                0 0.0000001
## 2
                1 0.00000072
                2 0.00002268
## 3
                3 0.00040824
## 5
                4 0.00459270
## 6
                5 0.03306744
## 7
                6 0.14880348
## 8
                7 0.38263752
## 9
                8 0.43046721
ggplot() +
 geom_col(mapping = aes(x = num_successes, y = probability),
   data = Paul_success_probs)
```



## **Expected Value**

- How many do we **expect** Paul to get right? (same as **average**, or **mean**)
- Weighted average of the possible values of X, weighted according to how likely they are

$$\mu = E(X) = \sum_{x} x P(X = x)$$

## Variance and Standard Deviation

• Variance: 
$$\sigma^2 = Var(X) = \sum_x (x - \mu)^2 P(X = x)$$

• Standard Deviation:  $\sigma = SD(X) = \sqrt{Var(X)}$