

Tree diagrams and the binomial distribution

Outline for today

Better know a player: Honus Wagner

Questions about worksheet 6?

Review of concepts in probability: additive and multiplicative rules

Tree diagrams and the analysis of Strat-o-matic

The binomial distribution

Announcement: class final projects

Final project proposal due on Wednesday

Should focus on research question

- Doesn't have to be about baseball, but need to find data set that you can use to answer the question

1-2 paragraph proposal is due the Wednesday March 29th

Projects presentation are on May 3rd – good to start working on them soon!

Better know a player: Honus
Wagner

Probability

Probability is a way of measuring the uncertainty of the outcome of an event

Definitions:

Sample space

- All possible outcomes

An Event

- Subset of the sample space

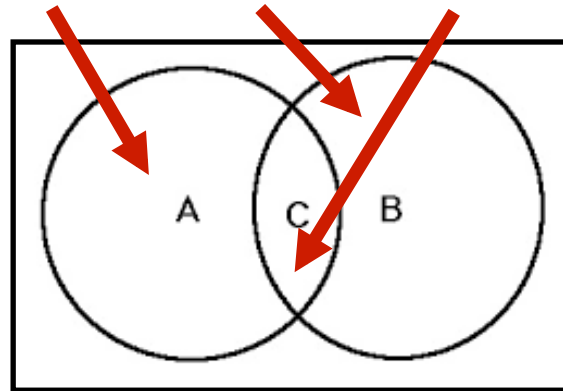
Probability key properties:

- $0 \leq \Pr(X) \leq 1$
- $\sum \Pr(X = x) = 1$

Probability rules - Additive rule

If there are two events A, and B, then the probability of A or B happening is:

$$\Pr(A \text{ or } B) = \Pr(A) + \Pr(B) - \Pr(A, B)$$



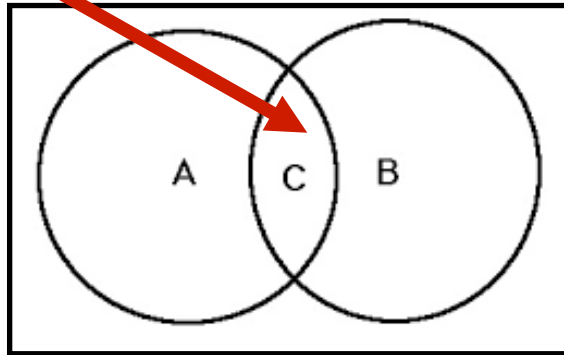
Events are called **mutually exclusive** if events A and B can not both occur - i.e., $\Pr(A, B) = 0$

Q: What would mutually exclusive events look like in the Venn diagram?

A: The circles would not overlap

Multiplicative Rule

$$\Pr(A, B) = \Pr(A|B) \times \Pr(B)$$



Probability of B happening
×

Probability of A happening
given B happened

Two events are independent if:

$$\Pr(A, B) = \Pr(A) \times \Pr(B)$$

i.e., if the occurrence of B does not effect the probability of A happening

Big League Baseball

For any one pitch (not assuming that the play is in play), what is the probability of getting a hit?

- Probability of a single: $1/3 \cdot 7/36$ +
- Probability of a double: $1/3 \cdot 1/36$ +
- Probability of a triple: $1/3 \cdot 1/36$ +
- Probability of a home run: $1/3 \cdot 1/36$ = 10/108

2nd Die

1st Die		1	2	3	4	5	6
	1	Single	Out	Out	Out	Out	Error
	2	Out	Double	Single	Out	Single	Out
	3	Out	Single	Triple	Out	Out	Out
	4	Out	Out	Out	Out	Out	Out
	5	Out	Single	Out	Out	Out	Single
	6	Error	Out	Out	Out	Single	Home run

Strat-o-matic



Much more complex board games

- Takes into account Hitters and Pitchers
- Advanced version accounts for additional factors (e.g., ball parks etc.)

Strat-o-matic rules and tree diagrams

Each player is represented by a card

1. A white single die is rolled to determine whether to use hitter or pitcher's card:

- 1-3 -> hitters card
- 4-6 -> pitcher's card



2. Then, two dice are rolled and their sum determines which play in the card should be used

3. For some plays additionally a 20 sided determine the final outcome

- and other tables/rules often need to be c

NELSON CRUZ			BRANDON MCCARTHY		
rightfield-2 leftfield-3			pitcher-3 batting # 1		
stealing-A running 1-12			starter		
TEXAS			PITCHING CARD		
1	2	3	4	5	6
2-flyball (cf)B 3-groundball (3b)A 4-groundball (3b)B 5-strikeout 6-strikeout 7-WALK 8-groundball (ss)A 9-strikeout 10-groundball (p)B 11-groundball (ss)A++ 12-lineout (2b) into as many outs as possible	2-flyball (cf)A 3-groundball (ss)A++ 4-groundball (ss)A 5-strikeout 6-strikeout 7-flyball (rf)B 8-strikeout 9-strikeout 10-flyball (cf)B 11-groundball (ss)A++ plus injury 12-WALK	2-SINGLE* 1-2 lineout (3b) 3-20 3-WALK 4-groundball (3b)B 5-SINGLE 6-HOMERUN 7-HOMERUN 1-10 DOUBLE 11-20 8-groundball (3b)A 9-DOUBLE** 1 SINGLE** 2-20 10-HOMERUN 11-SINGLE 12-flyball (rf)B	2-groundball (p)B 3-FLYBALL (lf)X 4-flyball (cf)B 5-groundball (2b)C 6-SINGLE* 1-10 lineout (3b) 11-20 7-flyball (rf)B 8-DOUBLE** 1-12 SINGLE** 13-20 9-flyball (lf)C 10-popout (1b) 11-FLYBALL (rf)X 12-flyball (lf)B	2-lineout (ss) 3-TRIPLE 1 DOUBLE 2-20 4-CATCHER'S CARD X 5-HOMERUN 1-19 DOUBLE 20 6-strikeout 7-GROUND-BALL(2b)X 8-flyball (cf)B 9-strikeout 10-GROUND-BALL(ss)X 11-strikeout 12-groundball (1b)C	2-groundball (1b)C 3-GROUND-BALL(p)X 4-GROUND-BALL(3b)X 5-strikeout 6-WALK 7-SINGLE 8-WALK 9-GROUND-BALL(ss)X 10-FLYBALL (cf)X 11-GROUND-BALL(1b)X 12-groundball (p)B
2009 BATTING RECORD			2009 PITCHING RECORD		
AVG	AB	2B	W	L	ERA
260	462	21	7	4	4.62
		1			17
		33			0
		76			
BB	SO	SB	HITS	SO	HOMERUNS
		CS			
		SLG%			
		ONBASE%			

Strat-o-matic: analysis

Let's calculate the probability of different events...

Calculating the probability of getting a particular column pitcher or hitter's card is pretty simple

- Answer?



Calculating the sum of the two dice is a little more involved...

- What is the sample space here?
 - i.e., how many possible outcomes are there?
- Can you calculate the probability distribution?



Strat-o-matic: analysis

Fill in the table below with the sum of the two dice and then calculate the probability of rolling a 2 to a 12

		2nd Die					
1st Die		1	2	3	4	5	6
	1						
	2						
	3						
	4			7			
	5						
	6						

Strat-o-matic: analysis

Fill in the table below with the sum of the two dice and then calculate the probability of rolling a 2 to a 12

		2nd Die					
1st Die		1	2	3	4	5	6
	1	2	3	4	5	6	7
	2	3	4	5	6	7	8
	3	4	5	6	7	8	9
	4	5	6	7	8	9	10
	5	6	7	8	9	10	11
	6	7	8	9	10	11	12

Strat-o-matic: analysis

2	3	4	5	6	7	8	9	10	11	12
1/36	2/36	3/36	4/36	5/36	6/36	5/36	4/36	3/36	2/36	1/36

2nd Die

1st Die

	1	2	3	4	5	6
1	2	3	4	5	6	7
2	3	4	5	6	7	8
3	4	5	6	7	8	9
4	5	6	7	8	9	10
5	6	7	8	9	10	11
6	7	8	9	10	11	12

Strat-o-matic: analysis

2	3	4	5	6	7	8	9	10	11	12
1/36	2/36	3/36	4/36	5/36	6/36	5/36	4/36	3/36	2/36	1/36

What is the probability of rolling a 1 on the white die **and then** getting a sum of 7 on the two red dice?

- $1/6 \cdot 6/36 = 6/216$

What is the probability of rolling a:

- 2 on the white die.... **and then** getting...
- Sum of 8 on the two red dice... **and then**...
- A number for 1-8 on the 20 sided die?
 - $1/6 \cdot 5/36 \cdot 8/20 = .00926$

Strat-o-matic: analysis

2	3	4	5	6	7	8	9	10	11	12
1/36	2/36	3/36	4/36	5/36	6/36	5/36	4/36	3/36	2/36	1/36

What is the probability of rolling a 1 on the white die **or** a 6 on the white die?

- $1/6 + 1/6 = 2/6$

What is the probability of rolling a:

- 5 on the white die... **and then** getting ...
- a sum of 8 **or** a sum of 10 on the two red dice?
- $1/6 \cdot (4/36 + 3/36) = .0324$

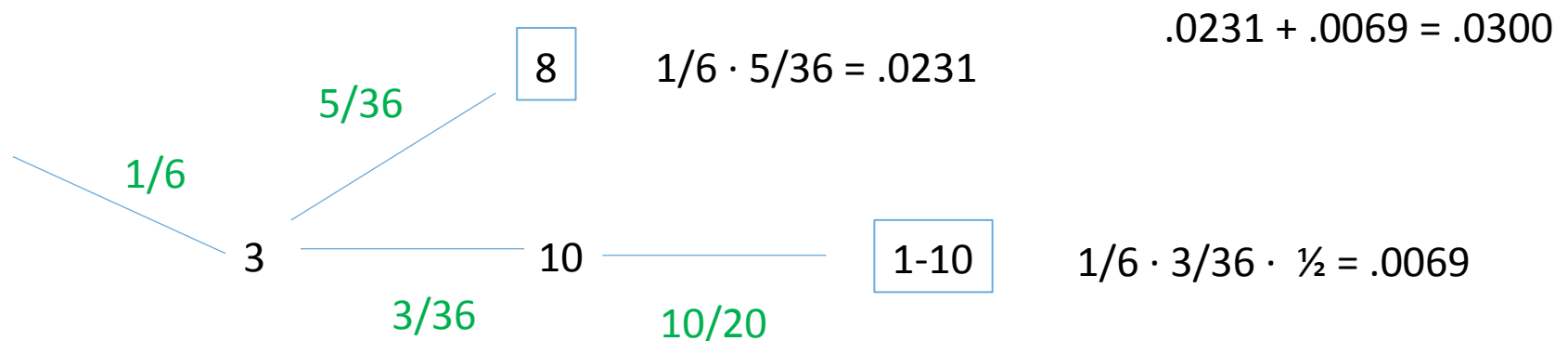
Strat-o-matic: analysis

2	3	4	5	6	7	8	9	10	11	12
1/36	2/36	3/36	4/36	5/36	6/36	5/36	4/36	3/36	2/36	1/36

What is the probability of rolling a 3 on the white die

- and then getting a sum of 8 two red dice
- or a sum of 10 on the two red dice
 - and then a 1-10 on the 20 sided die?

Tree diagram!



Strat-o-matic: Pujols vs. Kershaw

ALBERT PUJOLS			CLAYTON KERSHAW		
1st base-1 stealing-B running 1-11			pitcher-3 starter batting # 1		
ST. LOUIS			PITCHING CARD LOS ANGELES (NL)		
1	2	3	4	5	6
2-lineout (2b) into as many outs as possible	2-popout (2b) plus injury	2-flyball (lf)A	2-flyball (lf)C	2-groundball (p)B	2-WALK
3-groundball (ss)A++	3-popout (ss)	3-groundball (2b)A	3-FLYBALL (rf)X	3-GROUND- BALL(1b)X	3-GROUND- BALL(ss)X
4-HOMERUN	4-groundball (ss)A	4-groundball (ss)A	4-FLYBALL (cf)X	4-CATCHER'S CARD X	4-flyball (lf)C
5-HOMERUN	5-flyball (cf)B	5-SINGLE**	5-strikeout	5-strikeout	5-HOMERUN 1-2
6-HOMERUN 1-17	6-groundball (3b)A	6-SINGLE* 1-5	6-GROUND- BALL(ss)X	6-strikeout	flyball (lf)B
DOUBLE 18-20	7-flyball (lf)B	lineout (3b)	7-GROUND- BALL(2b)X	7-TRIPLE 1	3-20
7-DOUBLE	8-groundball (3b)A	6-20	8-strikeout	SINGLE**	6-DOUBLE** 1-14
8-DOUBLE** 1-2	9-strikeout	7-WALK	9-strikeout	2-20	SINGLE** 15-20
SINGLE** 3-20	10-groundball (p)A	8-groundball (ss)A	10-GROUND- BALL(3b)X	8-strikeout	7-SINGLE* 1
9-groundball (ss)A++	11-groundball (ss)A	9-WALK	11-FLYBALL (lf)X	9-strikeout	lineout (1b)
10-SINGLE	12-foulout (c)	10-WALK	12-groundball (p)B	10-strikeout	2-20
11-SINGLE		11-groundball (3b)A		11-GROUND- BALL(p)X	8-WALK
12-popout (ss)		12-flyball (rf)B		12-groundball (2b)C	9-WALK
					10-groundball (2b)C
					11-groundball (1b)C
					12-flyball (cf)B

What is the probability of a hitting a double?

Strat-o-matic: Pujols vs. Kershaw

ALBERT PUJOLS			CLAYTON KERSHAW		
1st base-1 stealing-B running 1-11			pitcher-3 starter batting # 1		
ST. LOUIS			PITCHING CARD LOS ANGELES (NL)		
1	2	3	4	5	6
2-lineout (2b) into as many outs as possible	2-popout (2b) plus injury	2-flyball (lf)A	2-flyball (lf)C	2-groundball (p)B	2-WALK
3-groundball (ss)A++	3-popout (ss)	3-groundball (2b)A	3-FLYBALL (rf)X	3-GROUND- BALL(1b)X	3-GROUND- BALL(ss)X
4-HOMERUN	4-groundball (ss)A	4-groundball (ss)A	4-FLYBALL (cf)X	4-CATCHER'S CARD X	4-flyball (lf)C
5-HOMERUN	5-flyball (cf)B	5-SINGLE**	5-strikeout	5-strikeout	5-HOMERUN 1-2
6-HOMERUN 1-17	6-groundball (3b)A	6-SINGLE* 1-5	6-GROUND- BALL(ss)X	6-strikeout	flyball (lf)B 3-20
DOUBLE 18-20	7-flyball (lf)B	lineout (3b)	7-GROUND- BALL(2b)X	7-TRIPLE 1	6-DOUBLE** 1-14
7-DOUBLE	8-groundball (3b)A	6-20	8-strikeout	SINGLE** 2-20	SINGLE** 15-20
8-DOUBLE** 1-2	9-strikeout	7-WALK	9-strikeout	8-strikeout	7-SINGLE* 1
SINGLE** 3-20	10-groundball (p)A	8-groundball (ss)A	10-GROUND- BALL(3b)X	9-strikeout	lineout (1b) 2-20
9-groundball (ss)A++	11-groundball (ss)A	9-WALK	11-FLYBALL (lf)X	10-strikeout	8-WALK
10-SINGLE	12-foulout (c)	10-WALK	12-groundball (p)B	11-GROUND- BALL(p)X	9-WALK
11-SINGLE		11-groundball (3b)A		12-groundball (2b)C	10-groundball (2b)C
12-popout (ss)		12-flyball (rf)B			11-groundball (1b)C
					12-flyball (cf)B

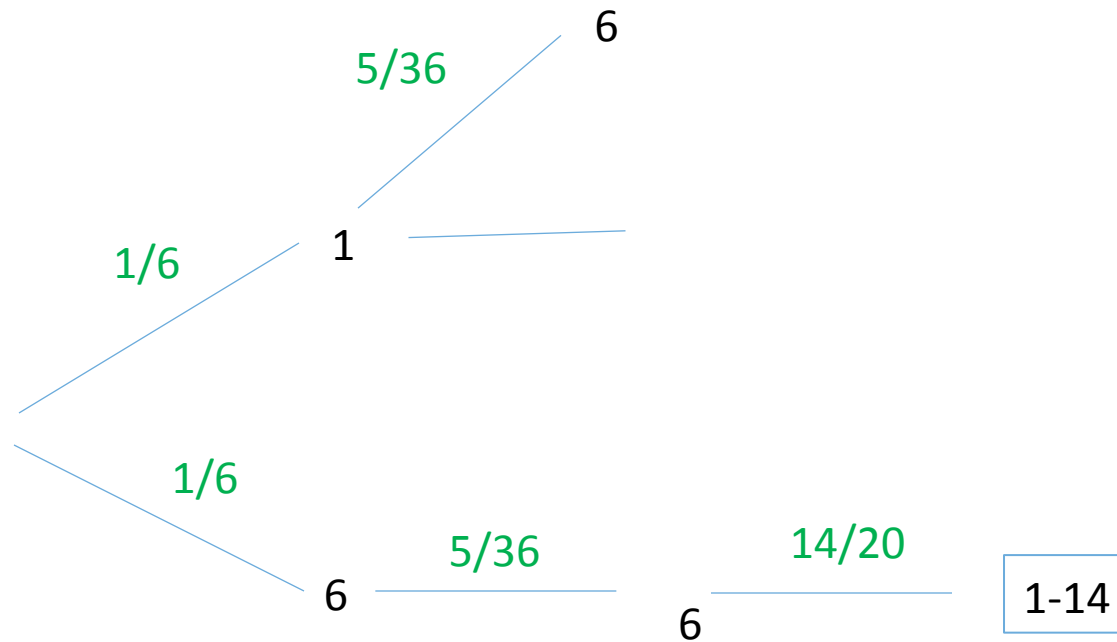
What is the probability of a hitting a double?

Strat-o-matic: Pujols vs. Kershaw

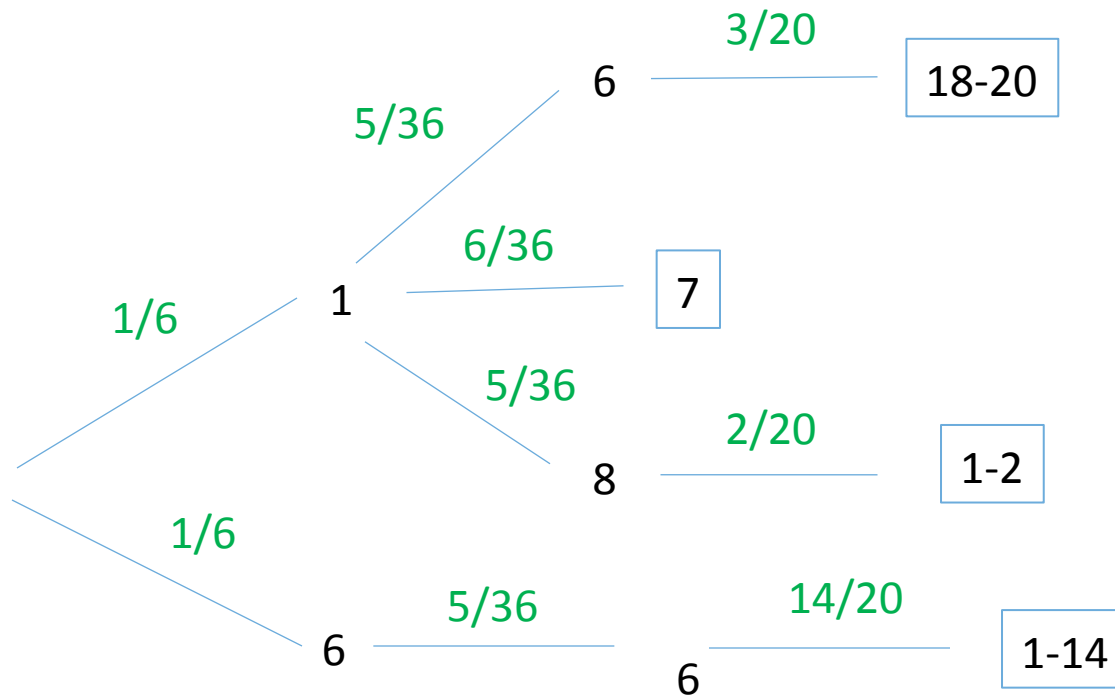
ALBERT PUJOLS			CLAYTON KERSHAW		
1st base-1 stealing-B running 1-11			pitcher-3 starter batting # 1		
ST. LOUIS			PITCHING CARD LOS ANGELES (NL)		
1	2	3	4	5	6
2-lineout (2b) into as many outs as possible	2-popout (2b) plus injury	2-flyball (lf)A	2-flyball (lf)C	2-groundball (p)B	2-WALK
3-groundball (ss)A++	3-popout (ss)	3-groundball (2b)A	3-FLYBALL (rf)X	3-GROUND-BALL(1b)X	3-GROUND-BALL(ss)X
4-HOMERUN	4-groundball (ss)A	4-groundball (ss)A	4-FLYBALL (cf)X	4-CATCHER'S CARD X	4-flyball (lf)C
5-HOMERUN	5-flyball (cf)B	5-SINGLE**	5-strikeout	5-strikeout	5-HOMERUN
6-HOMERUN 1-17	6-groundball (3b)A	6-SINGLE* 1-5	6-GROUND-BALL(ss)X	6-strikeout	1-2 flyball (lf)B
DOUBLE 18-20	7-flyball (lf)B	lineout (3b) 6-20	7-GROUND-BALL(2b)X	7-TRIPLE 1	3-20
7-DOUBLE	8-groundball (3b)A	7-WALK	8-strikeout	SINGLE** 2-20	6-DOUBLE** 1-14
8-DOUBLE** 1-2	9-strikeout	8-groundball (ss)A	9-strikeout	8-strikeout	SINGLE** 15-20
SINGLE** 3-20	10-groundball (p)A	9-WALK	10-GROUND-BALL(3b)X	9-strikeout	7-SINGLE* 1
9-groundball (ss)A++	11-groundball (ss)A	10-WALK	11-FLYBALL (lf)X	10-strikeout	lineout (1b) 2-20
10-SINGLE	12-foulout (c)	11-groundball (3b)A	12-groundball (p)B	11-GROUND-BALL(p)X	8-WALK
11-SINGLE		12-flyball (rf)B		12-groundball (2b)C	9-WALK
12-popout (ss)					10-groundball (2b)C
					11-groundball (1b)C
					12-flyball (cf)B

2	3	4	5	6	7	8	9	10	11	12
1/36	2/36	3/36	4/36	5/36	6/36	5/36	4/36	3/36	2/36	1/36

Tree diagram



Tree diagram



$$\frac{1}{6} \cdot \left(\frac{5}{36} \cdot \frac{3}{20} + \frac{6}{36} + \frac{5}{36} \cdot \frac{2}{20} \right) + \frac{1}{6} \cdot \frac{5}{36} \cdot \frac{14}{20} = .04977$$

Strat-o-matic: Pujols vs. Kershaw

ALBERT PUJOLS			CLAYTON KERSHAW		
1st base-1 stealing-B running 1-11			pitcher-3 starter batting # 1		
ST. LOUIS			PITCHING CARD LOS ANGELES (NL)		
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3-groundball (ss)A++	3-popout (ss)	3-groundball (2b)A	3-FLYBALL (rf)X	3-GROUND- BALL(1b)X	3-GROUND- BALL(ss)X
4-HOMERUN	4-groundball (ss)A	4-groundball (ss)A	4-FLYBALL (cf)X	4-CATCHER'S CARD X	4-flyball (lf)C
5-HOMERUN	5-flyball (cf)B	5-SINGLE**	5-strikeout	5-strikeout	5-HOMERUN 1-2
6-HOMERUN 1-17	6-groundball (3b)A	6-SINGLE* 1-5	6-GROUND- BALL(ss)X	6-strikeout	flyball (lf)B
DOUBLE 18-20	7-flyball (lf)B	lineout (3b)	7-GROUND- BALL(2b)X	7-TRIPLE 1	3-20
7-DOUBLE	8-groundball (3b)A	6-20	8-strikeout	SINGLE**	6-DOUBLE** 1-14
8-DOUBLE** 1-2	9-strikeout	7-WALK	9-strikeout	2-20	SINGLE** 15-20
SINGLE** 3-20	10-groundball (p)A	8-groundball (ss)A	10-GROUND- BALL(3b)X	8-strikeout	7-SINGLE* 1
9-groundball (ss)A++	11-groundball (ss)A	9-WALK	11-FLYBALL (lf)X	9-strikeout	lineout (1b)
10-SINGLE	12-foulout (c)	10-WALK	12-groundball (p)B	10-strikeout	2-20
11-SINGLE		11-groundball (3b)A		11-GROUND- BALL(p)X	8-WALK
12-popout (ss)		12-flyball (rf)B		12-groundball (2b)C	9-WALK
					10-groundball (2b)C
					11-groundball (1b)C
					12-flyball (cf)B

What is the probability of a hitting a home run?

Strat-o-matic: Pujols vs. Kershaw

ALBERT PUJOLS			CLAYTON KERSHAW		
1st base-1 stealing-B running 1-11			pitcher-3 starter batting # 1		
ST. LOUIS			PITCHING CARD LOS ANGELES (NL)		
1	2	3	4	5	6
2-lineout (2b) into as many outs as possible	2-popout (2b) plus injury	2-flyball (lf)A	2-flyball (lf)C	2-groundball (p)B	2-WALK
3-groundball (ss)A++	3-popout (ss)	3-groundball (2b)A	3-FLYBALL (rf)X	3-GROUND-BALL(1b)X	3-GROUND-BALL(ss)X
4-HOMERUN	4-groundball (ss)A	4-groundball (ss)A	4-FLYBALL (cf)X	4-CATCHER'S CARD X	4-flyball (lf)C
5-HOMERUN	5-flyball (cf)B	5-SINGLE**	5-strikeout	5-strikeout	5-HOMERUN 1-2
6-HOMERUN 1-17	6-groundball (3b)A	6-SINGLE* 1-5	6-GROUND-BALL(ss)X	6-strikeout	flyball (lf)B 3-20
DOUBLE 18-20	7-flyball (lf)B	lineout (3b) 6-20	7-GROUND-BALL(2b)X	7-TRIPLE 1	6-DOUBLE** 1-14
7-DOUBLE	8-groundball (3b)A	7-WALK	8-strikeout	SINGLE** 2-20	SINGLE** 15-20
8-DOUBLE** 1-2	9-strikeout	8-groundball (ss)A	9-strikeout	8-strikeout	7-SINGLE* 1
SINGLE** 3-20	10-groundball (p)A	9-WALK	10-GROUND-BALL(3b)X	9-strikeout	lineout (1b) 2-20
9-groundball (ss)A++	11-groundball (ss)A	10-WALK	11-FLYBALL (lf)X	10-strikeout	8-WALK
10-SINGLE	12-foulout (c)	11-groundball (3b)A	12-groundball (p)B	11-GROUND-BALL(p)X	9-WALK
11-SINGLE		12-flyball (rf)B		12-groundball (2b)C	10-groundball (2b)C
12-popout (ss)					11-groundball (1b)C
					12-flyball (cf)B

What is the probability of a hitting a home run?

Tree diagram!

$$1/6 \cdot [3/36 + 4/36 + 5/36 \cdot 17/20] + 1/6 \cdot (4/36 \cdot 2/20) = .0594$$

Parametric probability models

We have explored probability using:

- Probability rules to calculate the probability of an event
- Dice/spinners

We often use mathematical formulas, called probability distributions, to calculate the probability of different events

Random variates

We can think of a **random variate** as a random number

- Typically random variates are denoted with capital letters, e.g., X
- X can take on values in the sample space
 - Which in this case is a set of numbers

We can use probability distributions to assess the probability that a random variate X will have a value between two other numbers

- Notation: $\Pr(a < X < b)$

Random variates

Random variates can be either:

- Discrete: X takes on integer values
- Continuous: X takes on real values

Same properties of probability distributions apply:

- $\Pr(a < X < b) \geq 0$
- $\sum \Pr(X = x_i) = 1$

Bernoulli Distribution

Models the probability of two outcomes:

- Success: $X = 1$
- Failure: $X = 0$
- E.g., getting a head ($X = 1$) or a tail ($X = 0$) for flipping a coin

Model has one **parameter π** , which is the probability of getting a 1

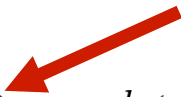
- E.g., the probability of getting head on a coin flip
- $\Pr(X = 1) = ?$ $\Pr(X = 0) = ?$

Bernoulli Distribution

Probability mass functions tell the probability of each outcome in the sample space of a discrete distribution

For Bernoulli Distributions we can write the probability mass function as:

$$f(k; \pi) = \begin{cases} \pi & \text{if } k = 1 \\ 1 - \pi & \text{if } k = 0 \end{cases} \quad f(k; \pi) = \pi^k (1 - \pi)^{1-k} \quad \text{for } k \in \{0, 1\}$$

Parameter π 

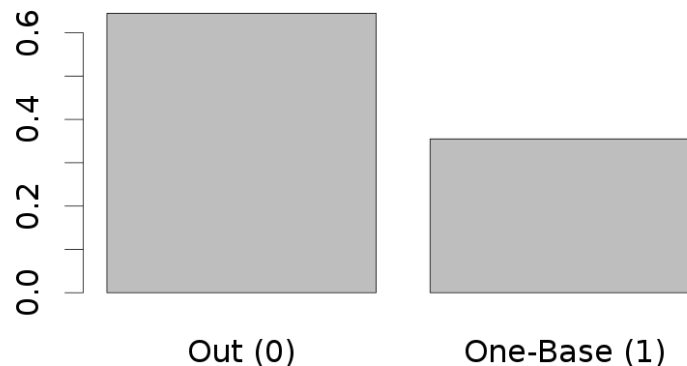
We can also plot the probability mass function

- If $\pi = .5$ what would it look like?
- If $\pi = .9$ what would it look like?

Bernoulli Distribution

Can you think of baseball example?

- Example: The probability that a player get on base for a given at bat
- If we were modeling David Ortiz, what would a good estimate of π be?
 - OBP = .355, so a good number to use would be $\pi = .355$



Binomial distribution

Models the probability of having k successes out of the n trials

- Probability of success on each trial is π

Example: if a player comes to bat 4 times in a game, what is the probability of getting on-base k times

- What is the sample space?

Assumes the same probability of getting on-base each plate appearance (π)

- Are the assumptions reasonable for this model?
 - No streakiness

Binomial distribution

Probability of getting ***k*** successes out of ***n*** trials is:

Parameters: π and n



$$Pr(X = k)$$

where
$$\binom{n}{k} = \frac{n!}{k!(n-k)!}$$

What values can X take on (i.e., what is the sample space)?

- k ranges from 0, 1, ..., n

n choose k

N choose k function tells us how many ways there are to order ***k*** items out of ***n*** total

$$\binom{n}{k} = \frac{n!}{k!(n-k)!}$$

Q: How many ways are there to choose 3 things out of a total of 8?

A: $(8 \cdot 7 \cdot 6) / (3 \cdot 2) = 56$

R: choose(n, k)