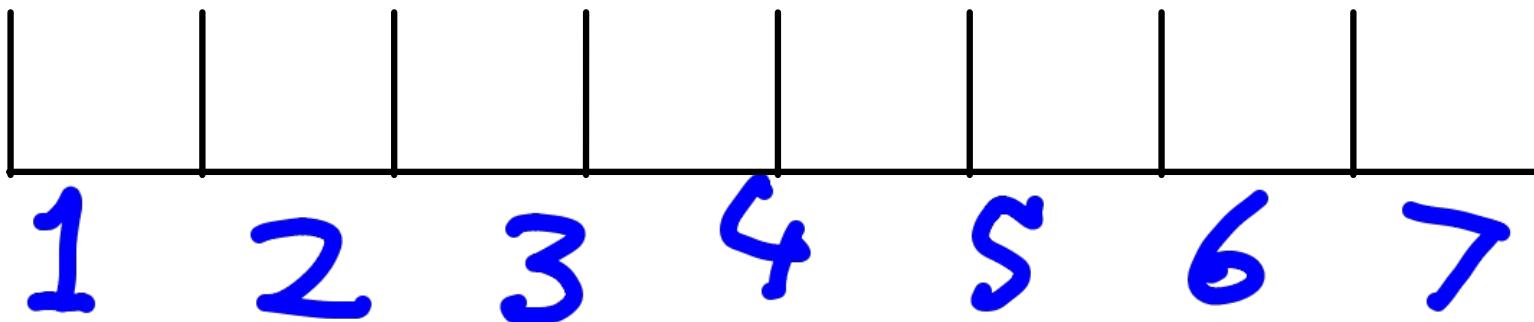
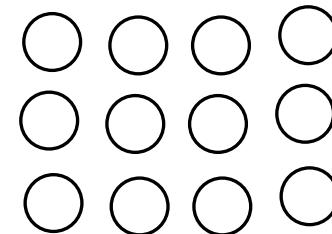
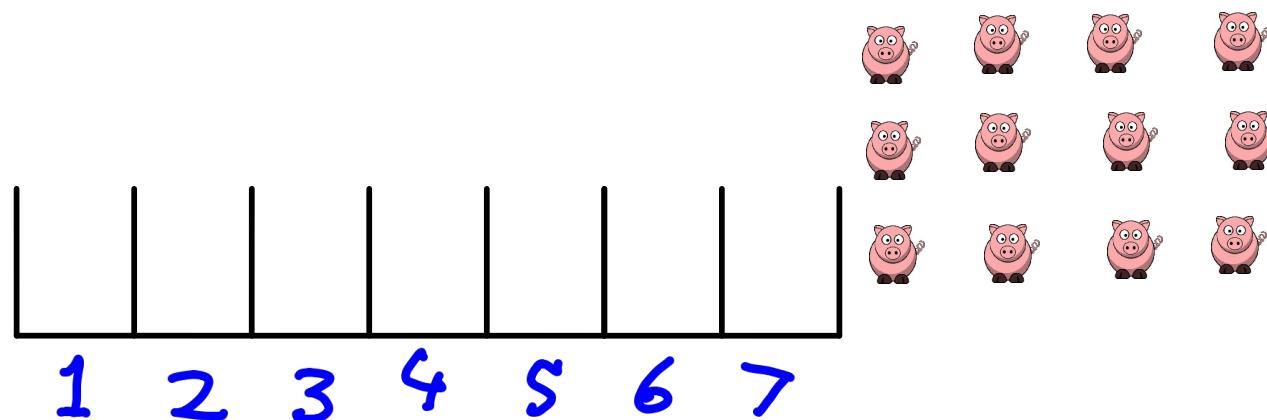


***Combinatorics 3***  
***poker hands***  
***and Some general probability***

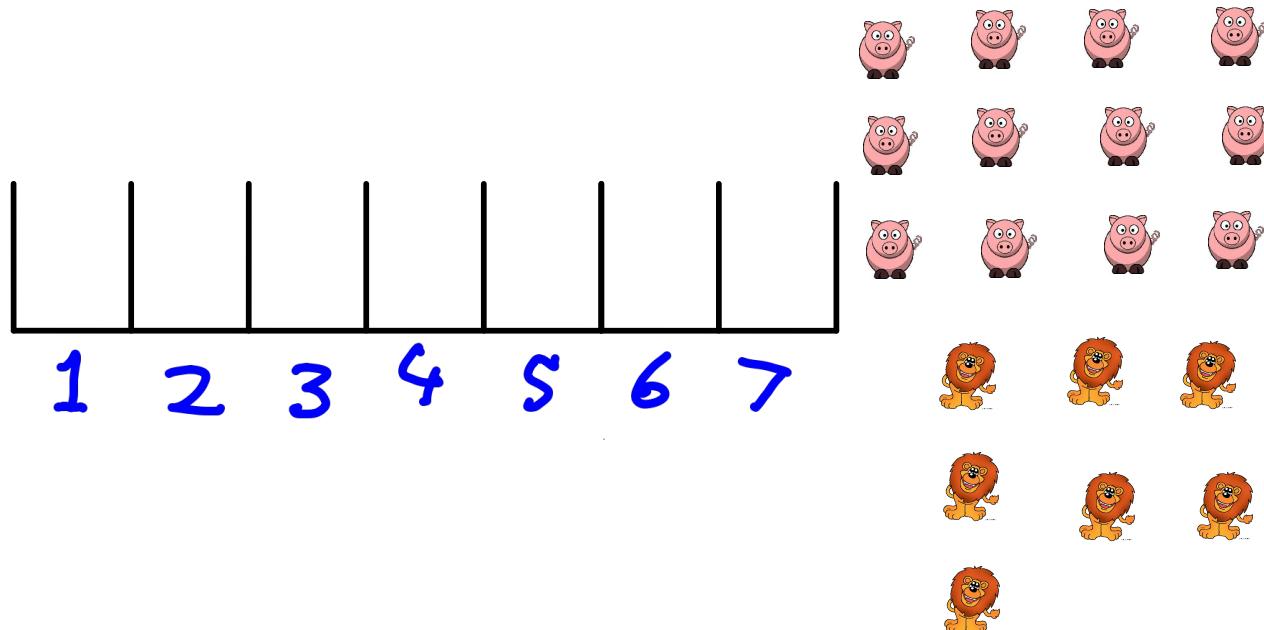
How many different ways to place 12 circles into 7 cells?  
(Each bin can hold any number of circles)



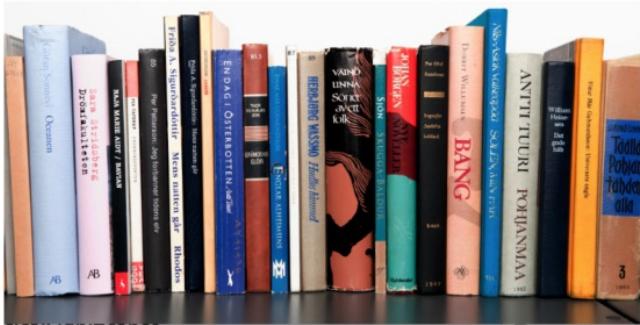
How many different ways to place 12 pigs into 7 bins such that each bin contains at least one pig ?



How many different ways to place 12 pigs and 7 lions into 7 bins,  
where each bin can contain any number of pigs and lions ?

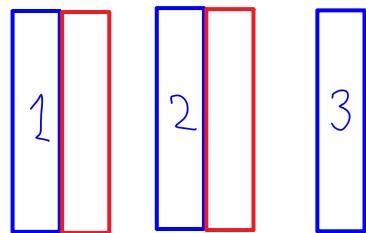


**You have a shelf with 24 books on it. You can pick any 3 books but no two picked books can be right next to each other. How many choices do you have?**



**24 books:**

1	2	3	4	5	6	7	8	9	1	1	1	1	1	1	1	1	2	2	2	2
0	1	2	3	4	5	6	7	8	9	0	1	2	3	4						



BLUE: chosen Book  
RED: place Holder

*Equivalent to choosing 3 out of 24-2=22 books:*

*If we care about order of chosen books:  $P(24-2,3)$*

*If we don't care about order of chosen books:  $C(24-2,3)$*



**If you choose 3 out of 24 books at random, what is the probability that at least 2 would be next to each other?**

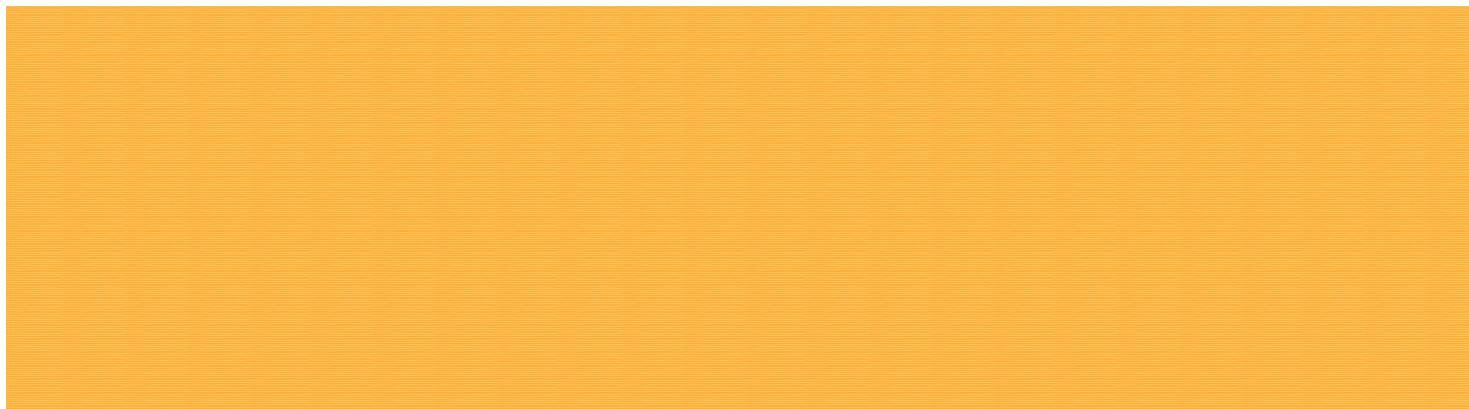
**Size of sample space ( $\Omega$ ):**

**number of way to choose 3 out of 24 books:**

**If we care about order of chosen books:  $P(24,3)$**

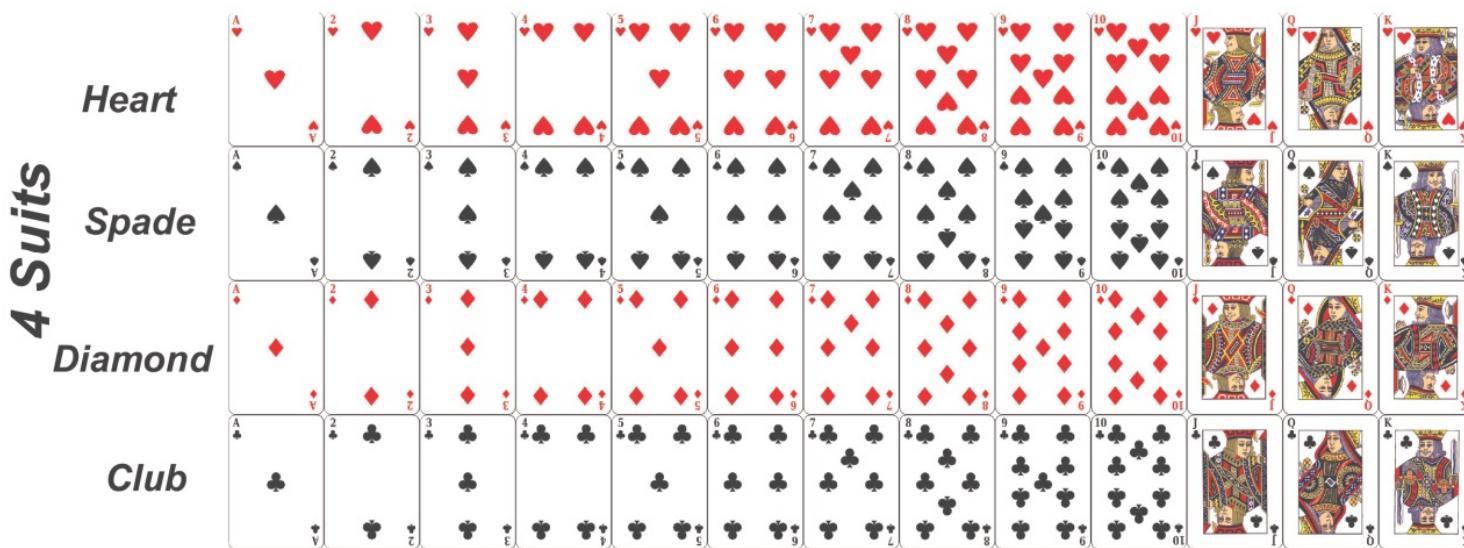
**If we don't care about order of chosen books:  $C(24,3)$**

$$P(A) = 1 - \frac{|A^c|}{|\Omega|} = 1 - \frac{P(22,3)}{P(24,3)} = 1 - \frac{C(22,3)}{C(24,3)}$$



## *Play cards*

*13 ranks*



*Total:  $4 \times 13 = 52$  cards*

***You pick one card from a shuffled deck.  
What is the probability that it is the Ace of Spades?***

***You pick one card from a shuffled deck.  
What is the probability that it is a spade or a diamond?***

***You pick one card from a shuffled deck.  
What is the probability that its rank is higher than 5?***

***Assuming that Ace is the highest we get 9/13***

## **Basic Poker Rules**

- 1. Each player has two private cards**
- 2. There are 5 shared cards**
- 3. A hand is 5 cards**
- 4. Hand with highest rank wins**

***High Rank = Low Probability***

## *The rank of hands in poker*

<b>1 Royal Flush</b>	<b>6 Straight</b>
	
<b>2 Straight Flush</b>	<b>7 Three of a Kind</b>
	
<b>3 Four of a Kind</b>	<b>8 Two Pair</b>
	
<b>4 Full House</b>	<b>9 One Pair</b>
	
<b>5 Flush</b>	<b>10 High Card</b>
	

## ***The basic rules of texas hold'm poker***

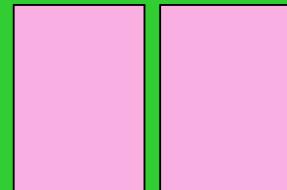
- 1. Each player is dealt 2 cards (the hole)***
- 2. A round of betting***
- 3. Three cards are revealed (the flop)***
- 4. A round of betting***
- 5. Fourth card is revealed (the turn)***
- 6. A round of betting***
- 7. Fifth card is revealed (the river)***
- 8. Final round of betting***
- 9. The highest ranked hand wins.***

***(unless everybody folds and the leader  
bluffs)***

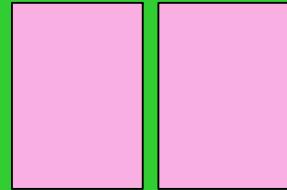
## **Betting rounds**

- 1. Proceed clockwise.**
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  - Raise: bet a larger amount**
  - fold: quit the game (losing the money already put in)**
- 4. A round of betting repeats circling until a round where all players either checked or folded = a round in which the bet has not increased.**
- 5. In the final round:**
  - if only one player remains, they win all of the bets (the pot).**
  - if more than one player is checked, there is a "showdown", the checked players show their cards and the one with the stronger hand wins.**

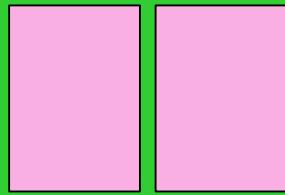
player 3



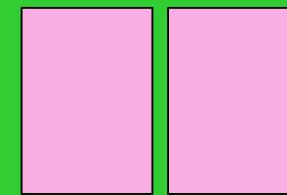
player 4



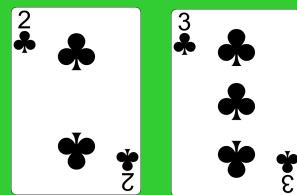
player 2



player 5



flop turn river



player 1  
(you)

## **Poker is a game of talent, not of chance**

*Each player tries to estimate the chances that theirs is a winning hand from the revealed cards and from the betting actions of the others.*

*At the high levels of the game, familiarity with the betting styles of other players is critical.*

*Winning or losing a single game is of little importance, it is the long term average that matters.*

**Curious?**

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<http://www.radiolab.org/story/278173-dealing-doubt/>*

*At a minimum, a player has to have an intuitive knowledge of the probabilities of different hands.*

**Which is what we will now do.**

## ***Calculating the probabilities of different hands***

***What is the sample space?***

***The sets of 5 cards out of 52.***

***Order does not matter***

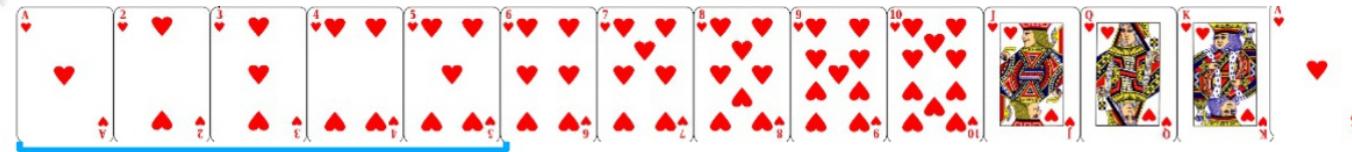
$$C(52,5) = 2,598,960$$



*1 choice for the card ranks  
4 choices for the suit  
 $Prob = 4/C(52,5)$*



*How many choices for the ranks?  
the Ace can be added on either side*



*choices for the card ranks (can't be royal)  
choices for the suit*

*Prob =*



*Number of choices for the rank of the 4 cards?*

*choices for the rank of the single?*

*choices for the suit of the single?*

*Prob =*



***Number of choices for the rank of the triple:***

***Number of choices for the rank of the pair:***

***Number of choices for the suits of the triple:***

***Number of choices for the suits of the pair :***

***Prob =***



*Number of choices for the ranks of the cards?*

*choices for the suit of the cards?*

*Prob =*



*How many choices for the card ranks?*



*How many choices for the card suits  
(cannot be royal flush or straight flush) ?*



*Prob =*





**Number of choices for the rank of the triple:**

**Number of choices for the suits of the triple:**

**Number of choices for the ranks of the other 2 cards**

**Number of choices for the suits of the other 2 cards:**

**Prob =**



*Unlike full house (2,3) the two pairs are indistinguishable*  
**Number of choices for the ranks of the pairs?**



**Number of choices for the rank of the single:**



**Number of choices for the suits of the pairs:**



**Number of choices for the suit of the single:**



**Prob =**





*The lowest ranked hand = The hand with highest probability*

*Number of choices for the pair:*

*The other 3 cards must not form a pair, else the hand will be two pairs or full house.*

*Number of possible ranks for the 3 cards:*

*Number of possible suites for the 3 cards:*

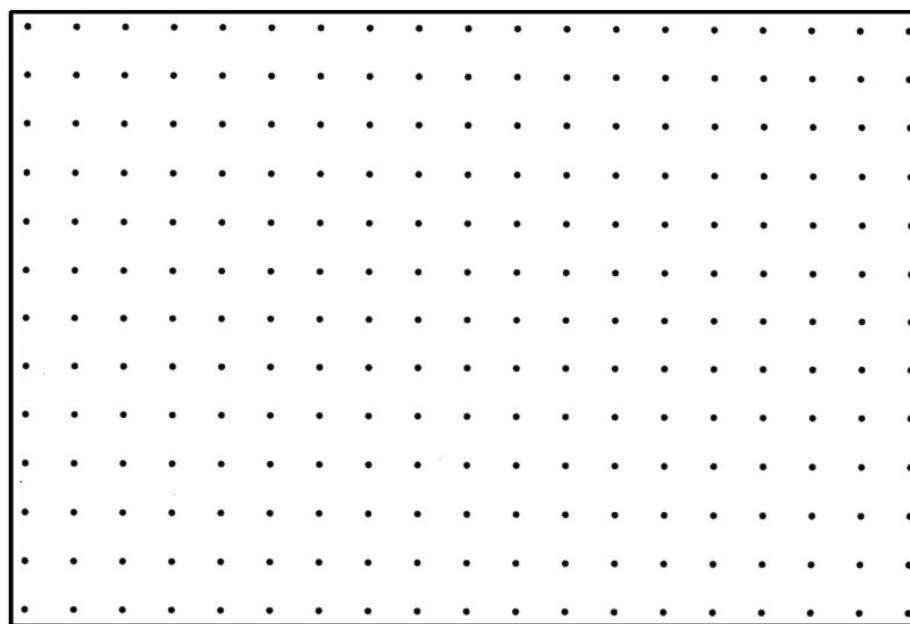
*Prob=*

Hand	Distinct Hands	Frequency	Probability	Cumulative probability	Odds	Mathematical expression of absolute frequency
Royal flush 	1	4	0.000154%	0.000154%	649,739 : 1	$\binom{4}{1}$
Straight flush (excluding royal flush) 	9	36	0.00139%	0.00154%	72,192 : 1	$\binom{10}{1} \binom{4}{1} - \binom{4}{1}$
Four of a kind 	156	624	0.0240%	0.0256%	4,164 : 1	$\binom{13}{1} \binom{12}{1} \binom{4}{1}$
Full house 	156	3,744	0.144%	0.17%	693 : 1	$\binom{13}{1} \binom{4}{3} \binom{12}{1} \binom{4}{2}$
Flush (excluding royal flush and straight flush) 	1,287	5,148	0.198%	0.367%	508 : 1	$\binom{13}{5} \binom{4}{1} - \binom{10}{1} \binom{4}{1}$
Straight (excluding royal flush and straight flush) 	10	10,200	0.392%	0.76%	254 : 1	$\binom{10}{1} \binom{4}{1}^5 - \binom{10}{1} \binom{4}{1}$
Three of a kind 	858	54,912	2.11%	2.87%	46.3 : 1	$\binom{13}{1} \binom{4}{3} \binom{12}{2} \binom{4}{1}^2$
Two pair 	858	123,552	4.75%	7.62%	20.0 : 1	$\binom{13}{2} \binom{4}{2}^2 \binom{11}{1} \binom{4}{1}$
One pair 	2,860	1,098,240	42.3%	49.9%	1.36 : 1	$\binom{13}{1} \binom{4}{2} \binom{12}{3} \binom{4}{1}^3$
No pair / High card 	1,277	1,302,540	50.1%	100%	0.995 : 1	$\left[ \binom{13}{5} - 10 \right] \left[ \binom{4}{1}^5 - 4 \right]$
Total	7,462	2,598,960	100%	---	1 : 1	$\binom{52}{5}$

## ***General Probability Spaces***

*Discrete, finite, uniform probability spaces*

$\Omega$



**So Far, we considered  
finite sample spaces and  
uniform distributions.**

<b>a</b>	<b>b</b>	<b>c</b>	<b>d</b>	<b>e</b>
0.2	0.2	0.2	0.2	0.2

$$P(\{a,c,d\}) = \frac{|\{a,c,d\}|}{|\{a,b,c,d,e\}|} = \frac{3}{5} = 0.6$$

**We now consider  
finite sample spaces and  
non-uniform distributions.**

<b>a</b>	<b>b</b>	<b>c</b>	<b>d</b>	<b>e</b>
0.1	0.2	0.5	0.1	0.1

$$\begin{aligned}P(\{a,c,d\}) &= p(a) + p(c) + p(d) \\&= 0.1 + 0.5 + 0.1 = 0.7\end{aligned}$$

## ***Properties of general probability distributions***

$$\forall A \subseteq \Omega, 0 \leq P(A) \leq 1 \quad P(\Omega) = 1$$

$$\forall A, B \subseteq \Omega, P(A \cup B) \leq P(A) + P(B)$$

$$\forall A, B \subseteq \Omega, A \cap B = \emptyset \quad \text{Disjoint sets}$$

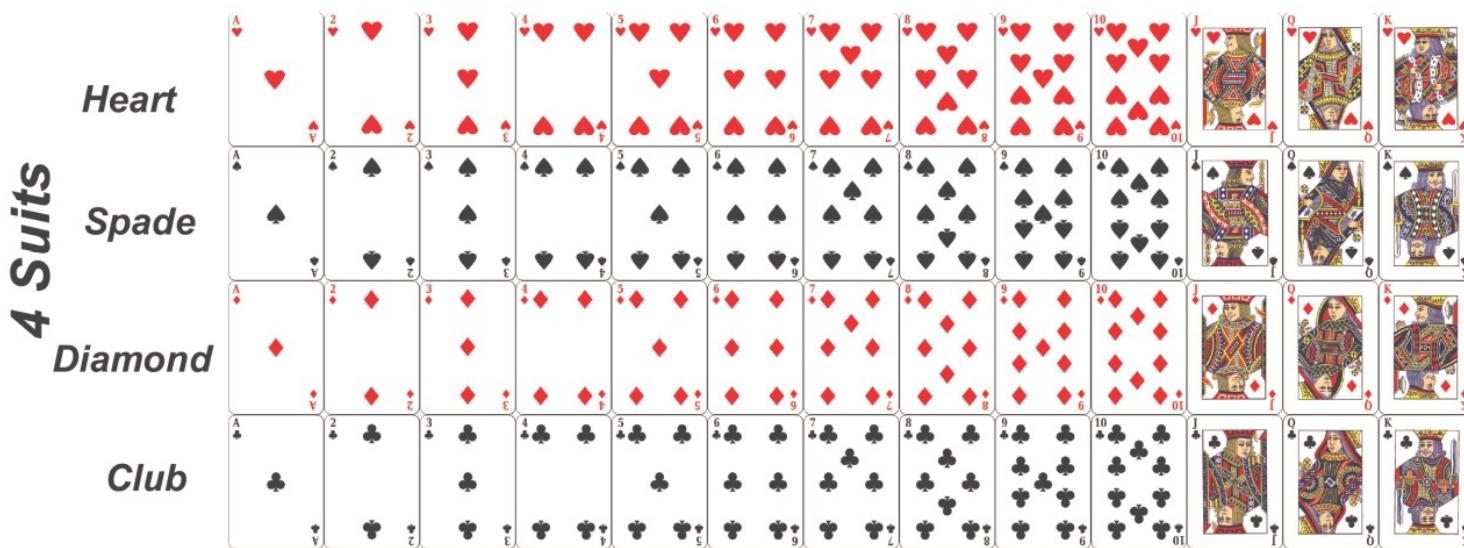
$$\Rightarrow P(A \cup B) = P(A) + P(B)$$



***Combinatorics 3***  
***poker hands***  
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## *Play cards*

*13 ranks*



*Total:  $4 \times 13 = 52$  cards*

**You pick one card from a shuffled deck.**

**What is the probability that it is the Ace of Spades?**

**1/52**

**You pick one card from a shuffled deck.**

**What is the probability that it is a spade or a diamond?**

**$2/4 = 1/2$**

**You pick one card from a shuffled deck.**

**What is the probability that its rank is higher than 5?**

**Assuming that Ace is the highest we get 9/13**

## ***Basic Poker Rules***

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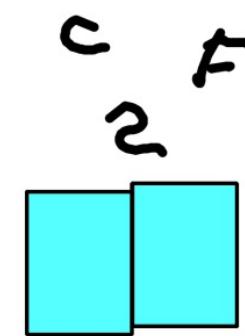
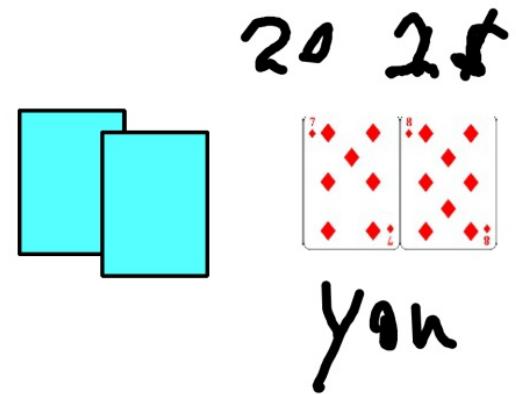
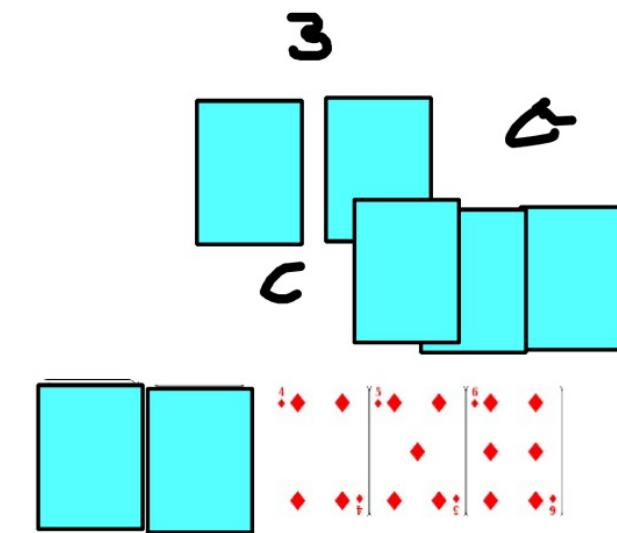
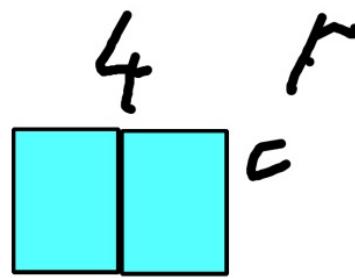
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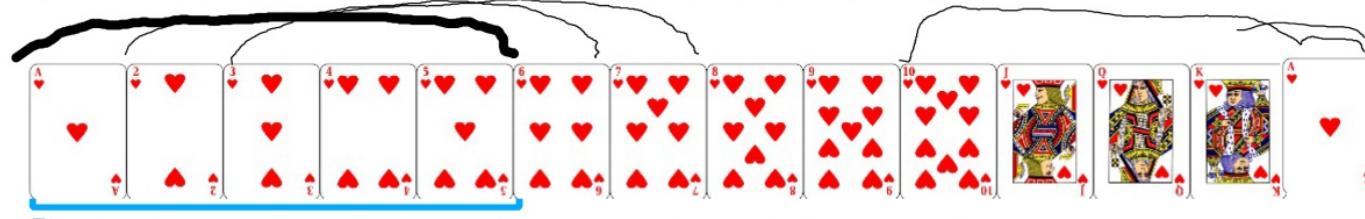
$$C(52,5) = 2,598,960$$



*1 choice for the card ranks  
4 choices for the suit  
 $Prob = 4/C(52,5)$*



*How many choices for the ranks?  
the Ace can be added on either side*



*9 choices for the card ranks (can't be royal)*

*4 choices for the suit*

$$\text{Prob} = 4 * 9 / C(52, 5) = 36 / C(52, 5)$$



*Number of choices for the rank of the 4 cards?*

13

/

*choices for the rank of the single?*

12

/

*choices for the suit of the single?*

4

$Prob = (13 \cdot 12 \cdot 4) / C(52, 5) = 624 / C(52, 5)$



**Number of choices for the rank of the triple:**

13

**Number of choices for the rank of the pair:**

12

**Number of choices for the suits of the triple:**

$$C(4,3)=4$$

**Number of choices for the suits of the pair :**

$$C(4,2)$$

$$\text{Prob} = (13 \cdot 12 \cdot C(4,3) \cdot C(4,2)) / C(52,5) = 3744 / C(52,5)$$



*Number of choices for the ranks of the cards?*

$$C(13,5) \approx 10$$

*choices for the suit of the cards?*

4

*Prob =*

$$(C(13,5)^*4)/C(52,5)=5148/C(52,5)$$



*Number of choices for the ranks of the cards?  
(excluding straight flush and royal flush)  
 $C(13,5)-10$*

*choices for the suit of the cards?  
4*

*Prob =  
 $(C(13,5)^*4)/C(52,5)=5148/C(52,5)$*



*How many choices for the card ranks?*

10

*How many choices for the card suits  
(cannot be royal flush or straight flush) ?*

$4^5 - 4$

*Prob =*

$$10 * (4^5 - 4) / C(52, 5) = 10,200 / C(52, 5)$$



$$C(4, 2)$$

**Number of choices for the rank of the triple:**  
13

$$\sim 10$$

**Number of choices for the suits of the triple:**  
 $C(4,3)=4$

**Number of choices for the ranks of the other 2 cards:**  
 $C(12,2)$

**Number of choices for the suits of the other 2 cards:**  
 $4*4$

$$\text{Prob} = (13*4*C(12,2)*4*4)/C(52,5) = 54,912/C(52,5)$$



*Unlike full house (2,3) the two pairs are indistinguishable*

**Number of choices for the ranks of the pairs?**

$$C(13,2)$$

**Number of choices for the rank of the single:**

**11**

**Number of choices for the suits of the pairs:**

$$C(4,2)^2$$

**Number of choices for the suit of the single:**

**4**

$$\text{Prob} = (C(13,2) * 11 * (C(4,2)^2) * 4) / C(52,5) = 123,552 / C(52,5)$$



*The lowest ranked hand = The hand with highest probability*

*Number of choices for the pair:*  
 $13^*C(4,2)$

*The other 3 cards must not form a pair, else the hand will be two pairs or full house.*

*Number of possible ranks for the 3 cards:*  
 $C(12,3)$

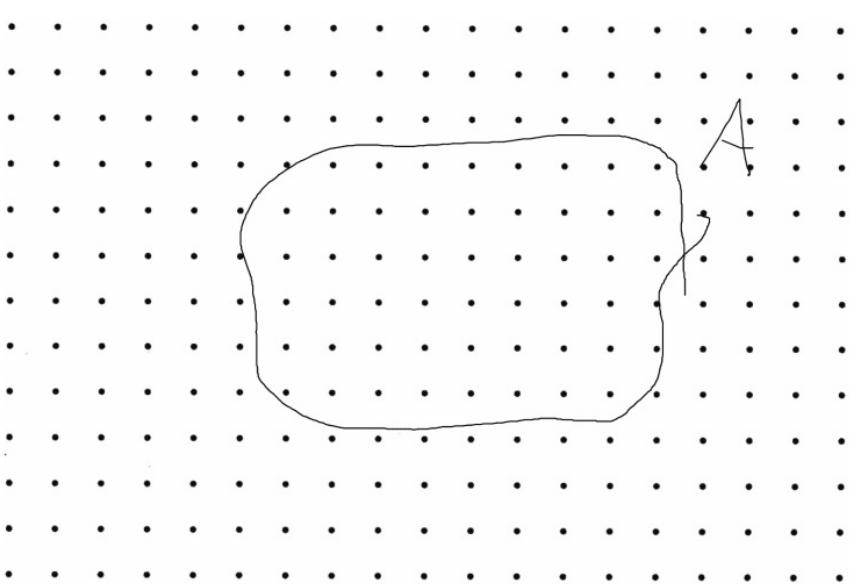
*Number of possible suites for the 3 cards:*  
 $4^{**}3$

*Prob=*  
 $(13^*C(4,2)^*C(12,3)^*4^{**}3)/C(52,5) = 1,098,240/C(52,5)$

Hand	Distinct Hands	Frequency	Probability	Cumulative probability	Odds	Mathematical expression of absolute frequency
Royal flush 	1	4	0.000154%	0.000154%	649,739 : 1	$\binom{4}{1}$
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Total	7,462	2,598,960	100%	---	1 : 1	$\binom{52}{5}$

## Counting probability distributions

Until now, we considered finite outcome spaces where all outcomes the same probability.



$$P(A) = \frac{|A|}{|Q|}$$

All events have rational probabilities:  $n/m$   
In general, probabilities can be irrational.

## **Properties of general probability distributions**

*every event has probability between 0 and 1.*       $\forall A \subseteq \Omega, 0 \leq P(A) \leq 1$

*The outcome space has probability 1.*       $P(\Omega) = 1$

*The probability of a union is at most the sum of the probabilities*

$$\forall A, B \subseteq \Omega, P(A \cup B) \leq P(A) + P(B)$$

*The probability of a union of disjoint sets is equal to the sum of the probabilities*

$$\forall A, B \subseteq \Omega, A \cap B = \emptyset \quad \text{Disjoint sets}$$
$$\Rightarrow P(A \cup B) = P(A) + P(B)$$

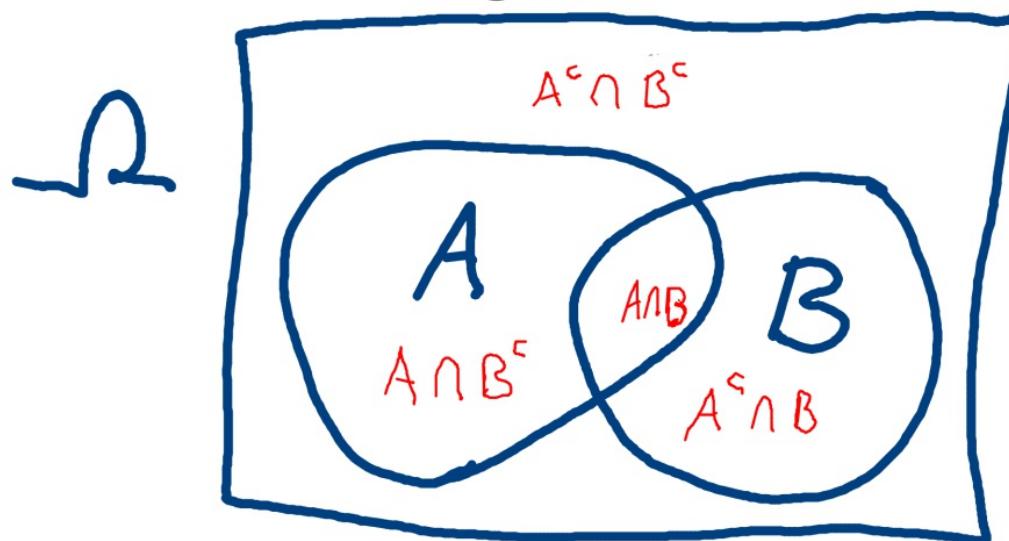
Implies that:  $P(A^c) = 1 - P(A)$

$$A \cup A^c = \Omega, P(\Omega) = 1, A \cap A^c = \emptyset$$

$$\Rightarrow P(A) + P(A^c) = 1$$

**The total probability equation**

## **Partitioning a union**



$$A \cup B = (A \cap B^c) \cup (A^c \cap B) \cup (A \cap B)$$

$$\begin{aligned}P(A \cup B) &= P(A \cap B^c) + P(A^c \cap B) + P(A \cap B) \\&= P(A) + P(B) - P(A \cap B)\end{aligned}$$

If  $P(A) = \frac{1}{2}$ ,  $P(B) = \frac{1}{3}$ ,  $P(A \cap B) = \frac{1}{6}$ , What is  $P(A \cup B) =$  ?

$$P(A \cup B) = P(A) + P(B) - P(A \cap B)$$

$$= \frac{1}{2} + \frac{1}{3} - \frac{1}{6} = \frac{2}{3}$$

**A few simple questions:**

If  $P(A) = \frac{1}{2}$ ,  $P(B) = \frac{2}{3}$ , What can be said about  $P(A \cap B)$  ?

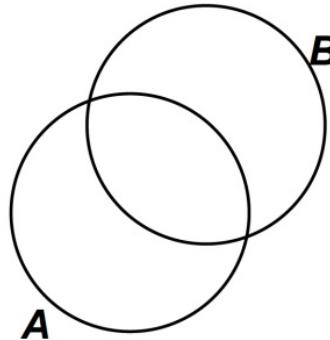
at most  $A \cap B \subseteq A$        $P(A \cap B) \leq P(A) = \frac{1}{2}$

at least  $P(A \cup B) = P(A) + P(B) - P(A \cap B)$   
 $\frac{1}{2} + \frac{2}{3}$

$$P(A \cap B) \geq \frac{1}{6}$$

**General Formula:**

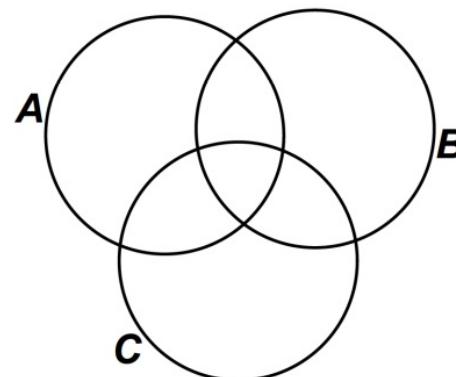
$$P(A \cup B) = P(A) + P(B) - P(A \cap B)$$



**How about:**

$$P(A \cup B \cup C) = ?$$

$$\begin{aligned} &P(A) + P(B) + P(C) \\ &- P(\end{aligned})$$



## *For Tue.*

- 1. *Finish Week2 homework.***
- 2. *Read class notes:***
  - *Section 4.5 (Poker)***
  - *Chapter 5***

***The total probability equation for (countably) infinite sets***

$$A_1, A_2, A_3, \dots \subseteq \Omega$$

$$\forall i \neq j, A_i \cap A_j = \emptyset$$

$$A_1 \cup A_2 \cup A_3 \cup \dots \doteq \bigcup_{i=1}^{\infty} A_i = \Omega$$

$$\text{Then } \sum_{i=1}^{\infty} P(A_i) = 1$$

***Consider the natural numbers: 1,2,3,...***

***Is it possible to define a uniform distribution over them?***

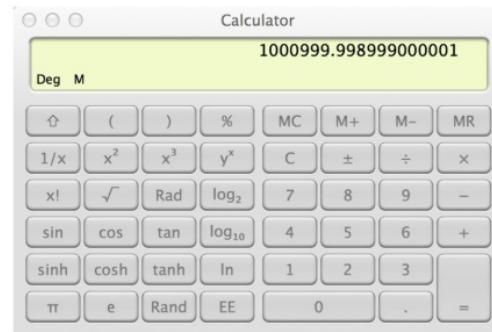
***1st possibility:  $0=P(1)=P(2)=\dots$***        $P(\Omega) =$

---

***2nd possibility:  $0 < P(1)=P(2)=\dots$***        $P(\Omega) =$

## ***General Probability Spaces***

$$\frac{1}{1000} - \frac{1}{1001} = \frac{1}{\frac{1001-1000}{1000 \times 1001}} = 1001000$$



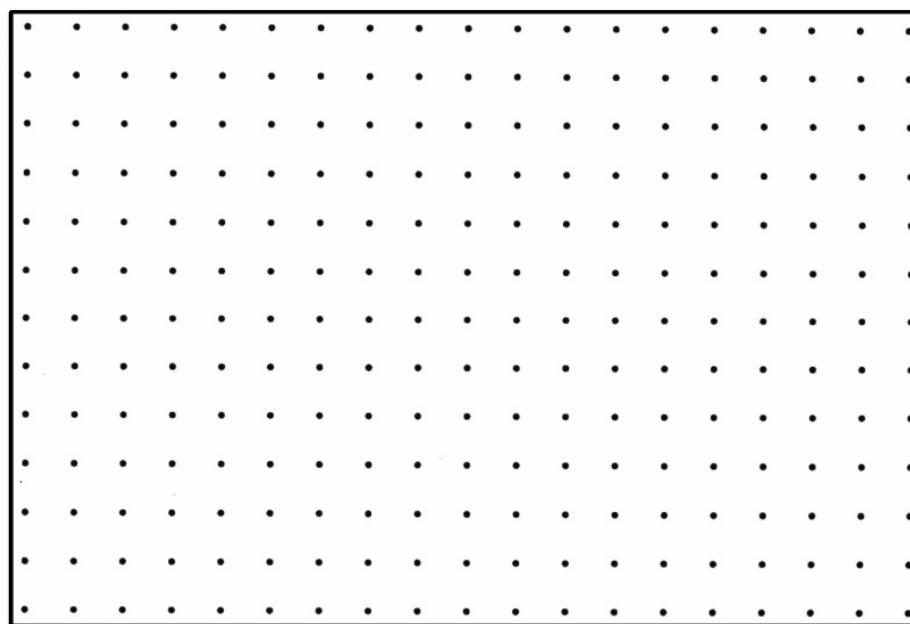
**$1/10000 = 1e-4$  not  $9.9E-5$**

***WebWork checks your answers against the correct answers within some tolerance.  
If you use a calculator your mistake might be masked and reappear at a later point in the problem.***

***Write complete expressions, don't use a calculator!***

*Discrete, finite, uniform probability spaces*

$\Omega$



**So Far, we considered  
finite sample spaces and  
uniform distributions.**

<b>a</b>	<b>b</b>	<b>c</b>	<b>d</b>	<b>e</b>
0.2	0.2	0.2	0.2	0.2

$$P(\{a,c,d\}) = \frac{|\{a,c,d\}|}{|\{a,b,c,d,e\}|} = \frac{3}{5} = 0.6$$

**We now consider  
finite sample spaces and  
non-uniform distributions.**

<b>a</b>	<b>b</b>	<b>c</b>	<b>d</b>	<b>e</b>
0.1	0.2	0.5	0.1	0.1

$$\begin{aligned}P(\{a,c,d\}) &= p(a) + p(c) + p(d) \\&= 0.1 + 0.5 + 0.1 = 0.7\end{aligned}$$

## ***Properties of general probability distributions***

$$\forall A \subseteq \Omega, 0 \leq P(A) \leq 1 \quad P(\Omega) = 1$$

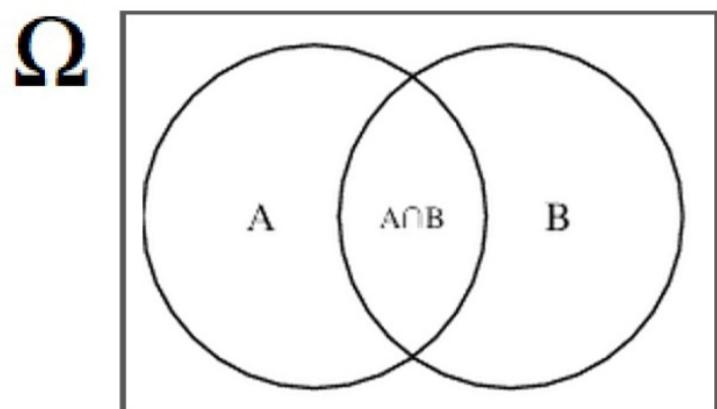
$$\forall A, B \subseteq \Omega, P(A \cup B) \leq P(A) + P(B)$$

$$\forall A, B \subseteq \Omega, A \cap B = \emptyset \quad \text{Disjoint sets}$$

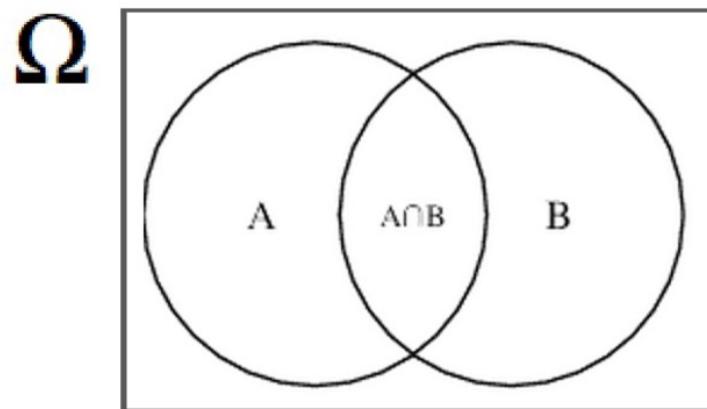
$$\Rightarrow P(A \cup B) = P(A) + P(B)$$

**A few simple questions:**

If  $P(A) = \frac{1}{2}$ ,  $P(B) = \frac{2}{3}$ , What can be said about  $P(A \cap B)$  ?



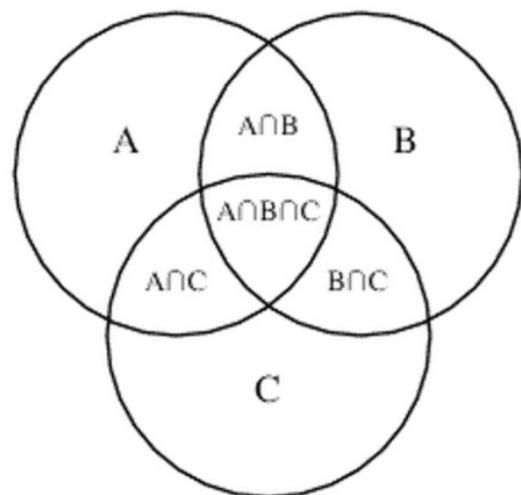
If  $P(A) = \frac{1}{2}$ ,  $P(B) = \frac{1}{3}$ ,  $P(A \cap B) = \frac{1}{6}$ , What is  $P(A \cup B) =$  ?



**General Formula:**  $P(A \cup B) = P(A) + P(B) - P(A \cap B)$

**How about:**  $P(A \cup B \cup C) = ?$

$$\begin{aligned}P(A \cup B \cup C) &= P(A) + P(B) + P(C) \\&\quad - P(A \cap B) - P(A \cap C) - P(B \cap C) \\&\quad + P(A \cap B \cap C)\end{aligned}$$



*The inclusion/exclusion principle*

## **Countably infinite sets**

*The natural numbers: 1,2,3,4,5....*

- an **infinite** set
- represents **counting**
- A set is *infinitely countable if each element can be given an integer index.*
- *Equivalently, if the elements can be put in a list*

***The total probability equation for (countably) infinite sets***

$$A_1, A_2, A_3, \dots \subseteq \Omega$$

$$\forall i \neq j, A_i \cap A_j = \emptyset$$

$$A_1 \cup A_2 \cup A_3 \cup \dots \doteq \bigcup_{i=1}^{\infty} A_i = \Omega$$

$$\text{Then } \sum_{i=1}^{\infty} P(A_i) = 1$$

***Consider the natural numbers: 1,2,3,...***

***Is it possible to define a uniform distribution over them?***

1st possibility:  $0 = P(1) = P(2) = \dots$        $P(\Omega) =$

---

2nd possibility:  $0 < P(1) = P(2) = \dots$        $P(\Omega) =$

What is the meaning of  $\sum_{i=1}^{\infty} p_i$  ?

$$p_i \geq 0, \quad \sum_{i=1}^{\infty} p_i \doteq \lim_{n \rightarrow \infty} \sum_{i=1}^n p_i$$

This is a non-decreasing sequence  
it can either converge to  
some real number or to infinity (  $\infty$  )

**$p_i = c$  (constant)**     $\sum_{i=1}^{\infty} c = \lim_{n \rightarrow \infty} nc,$

If  $c = 0$ :  $0,0,0,0,0,0 \rightarrow 0$

If  $c > 0$ :  $c, 2c, 3c, 4c \rightarrow \infty$

Is it enough if  $p_i \xrightarrow{i \rightarrow \infty} 0$ ?

Can we define a distribution of the form  $P(i)c/i$ ?

**No, because**  $\sum_{i=1}^{\infty} (1/i) = \infty$

$$\left(\frac{1}{1}\right), \left(\frac{1}{2}\right), \left(\frac{1}{3}, \frac{1}{4}\right), \left(\frac{1}{5}, \frac{1}{6}, \frac{1}{7}, \frac{1}{8}\right), \dots$$

$$\sum_{i=1}^n \frac{1}{i} \approx \ln n$$

Can we define a distribution of the form  $P[X(\omega) = i] = \frac{c}{i^2}$  ?

**Yes, because**  $\sum_{i=1}^{\infty} \frac{1}{i^2} = \frac{\pi^2}{6} \approx 1.6449\dots$

**If we define the distribution to be**  $P(X = i) = \frac{6}{\pi^2 i^2}$

**Then the sum of the probabilities over all natural numbers is 1**

**If the series is finite then we can define a distribution by dividing each term by the sum of the series  
= the normalization factor**

$$\text{if } \alpha > 1 \quad \sum_{i=1}^{\infty} \frac{1}{i^\alpha} < \infty$$

- **Geometric Series:** Let  $r$  be a number in the range  $[0, 1]$ , i.e.  $0 \leq r \leq 1$ . Then:

$$\sum_{i=0}^{\infty} r^i = \frac{1}{1-r}$$

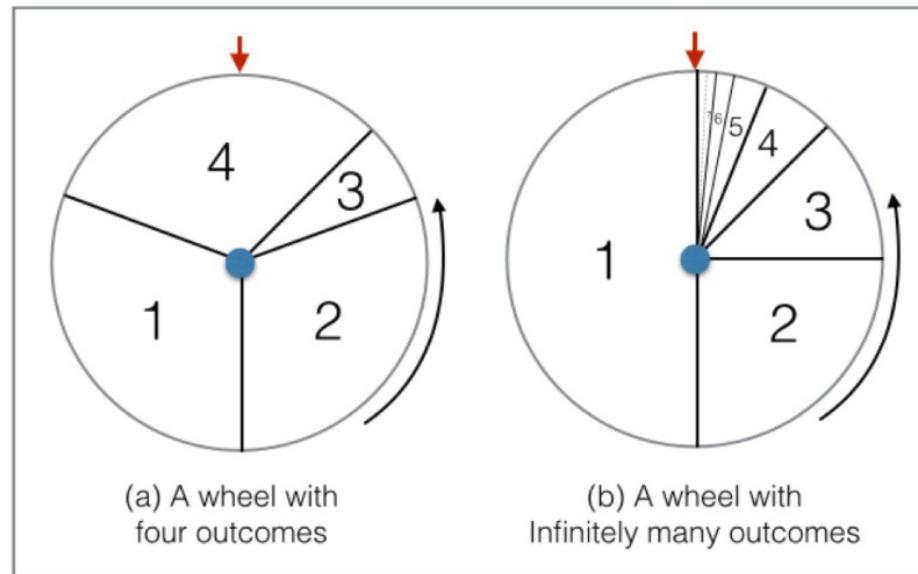
$$\sum_{i=1}^{\infty} r^i = \frac{r}{1-r}$$

and

$$\sum_{i=1}^{\infty} ir^i = \frac{r}{(1-r)^2}$$

**Note that if  $r=1$  the sums are infinite.**

## *Probabilities over uncountable sets*



***How can we define the uniform distribution over angles?***  
***Each angle has probability 0***  
***Summing over all angle still gives 0***

**It seems like we can represent the points on the line using a countable set**

**Numbers that can be written as  $i/j$ , where  $i,j$  are natural numbers**

**Each element corresponds to a pair of natural numbers. Therefore the**

**The rational numbers in  $[0,1]$ :**



**The distance between  $i/n$  and  $(i+1)/n$  is  $1/n$**

**As  $n$  increases the distance decreases to zero**

**---> the rationals are dense on the line**

**= there is a rational number arbitrarily close to any positive real number**

**Does that mean that all real numbers are rational? NO! ( $\sqrt{2}$ )**

**Does that mean that the reals are countable? NO!**

*The real number  $0 \leq x \leq 1$  are uncountable*

*Proof by contradiction:*

1. suppose they are countable.
2. write the list of **all** of the numbers in binary expansion

*0.000001101001100011100010001000...*

*0.000101101001100011100010001000...*

*0.000000101001100011100010001000 ...*

*0.0000001001001100011100010001000 ...*

*0.0000001100001100011100010001000 ...*

*0.0000001101000000011100010001000 ...*

*0.0000001101001111011100010001000 ...*

*0.0000001101001100111100010001000 ...*

*0.000000110100110001100010001000 ..*

*Construct a number that differes from the 1st element in the  
1st position, from the 2nd in the 2nd position ...*

*0.11111001011...*

*This number is not in the list: contradiction*

*The uniform distribution over [0,1]*

$$0 \leq x_1, x_2, \dots \leq 1$$

$$P(\{x_1\}) = 0$$

$$P(\{x_1, x_2\}) = 0$$

$$P(\{x_1, x_2, x_3, \dots\}) = 0$$

But, if  $0 \leq a < b \leq 1$

$$P([a, b]) = b - a$$

*This is called a density distribution.  
General density distributions - on monday.*

## ***For Friday***

- 1. Read Chapter 5 (it is updated)***
- 2. Start working on the homework (Get going, it is harder than previous)***
- 3. Akshay will replace me on Friday lecture.***