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# PHIL 313Q: Inductive Logic

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ch. 4 of "Probability and Inductive Logic" by Ian Hacking

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## Propositions & Events

- We have language to assign probabilities to two kinds of things:
  - (i) propositions and (ii) events
    - **Propositions** are statements, assertions, or conjectures
      - e.g. that you'll have a car accident this year
      - e.g. that it will thunderstorm tonight
      - propositions are *true* or *false*, like the sentences of SL and PL
      - “That it will thunderstorm tonight is probable.”
    - **Events** are happenings, occurrences, or things that take time
      - e.g. a car accident involving you this year
      - e.g. a thunderstorm tonight
      - events *occur* or *do not occur*
      - “A thunderstorm tonight is probable.”

## Proposition Notation

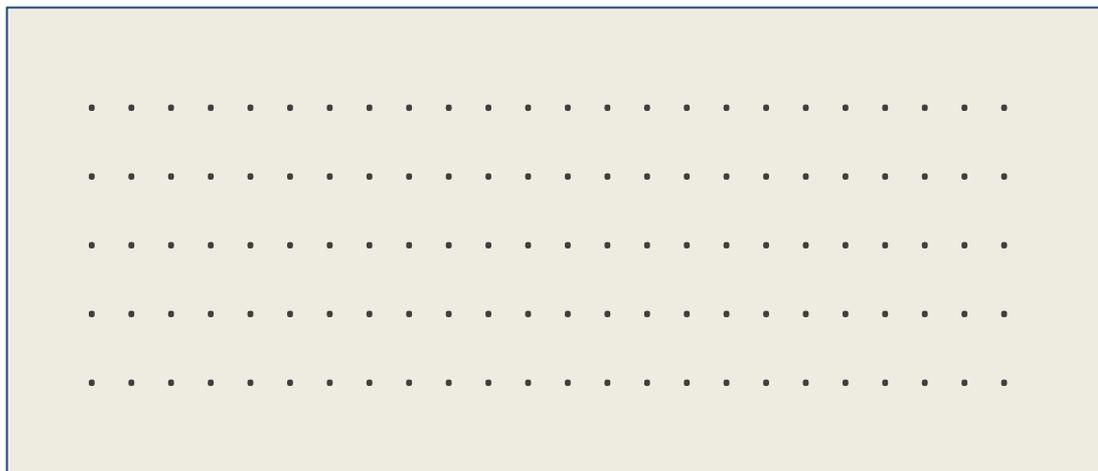
- We'll use capital letters, like in sentential logic (SL), to symbolize propositions
  - that a thunderstorm will occur tonight = **T**
  - that you will have a car accident this year = **C**
- We'll use *some* of the logical connectives of SL, too, namely:
  - Disjunction: '**v**'
  - Conjunction: '**&**'
  - Negation: '**~**'
- These combine to form sentences, like in SL
  - **(O v C)**
  - **~O**
  - **(O & C) v F**

## Event Notation

- While logicians tend to use proposition-language, statisticians tend to use event-language
- They use capital letters to symbolize events
  - a thunderstorm tonight = **T**
  - a car accident this year = **C**
- But the logical connectives don't make much sense – what would the following event even be: **(T & C)**
- So, statisticians use *set theory notation* instead of *logical connectives*
  - **(T ∪ C)** instead of **(T ∨ C)**
  - **(T ∩ C)** instead of **(T & C)**
  - **T'** instead of **~T**

## Behind the Scenes

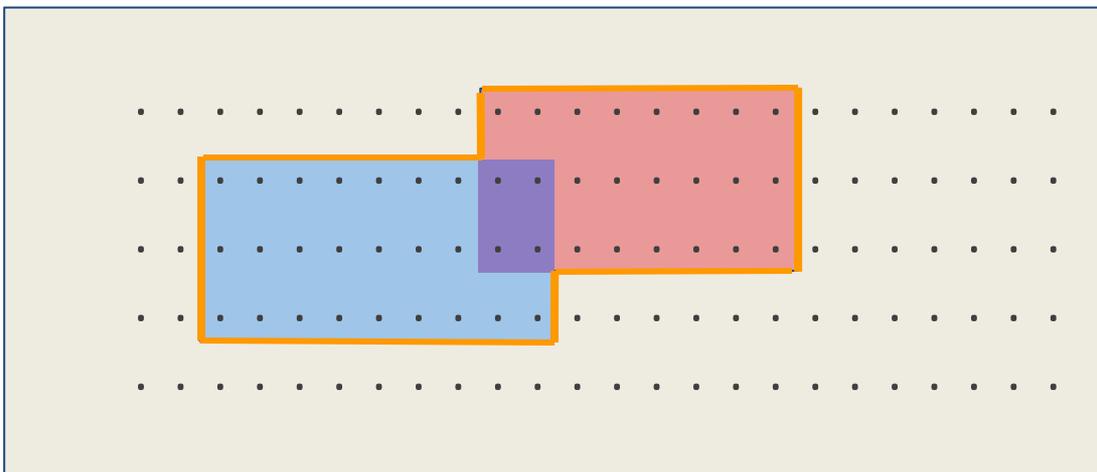
- What's really happening here is that there are just two ways of talking about the same underlying reality



- The dots represent “possible worlds”, or complete ways the world could be
- In some worlds, you have a car accident this year. In others, you don't.
- In some worlds, it will thunderstorms tonight. In others, it doesn't.

## Behind the Scenes: Propositions

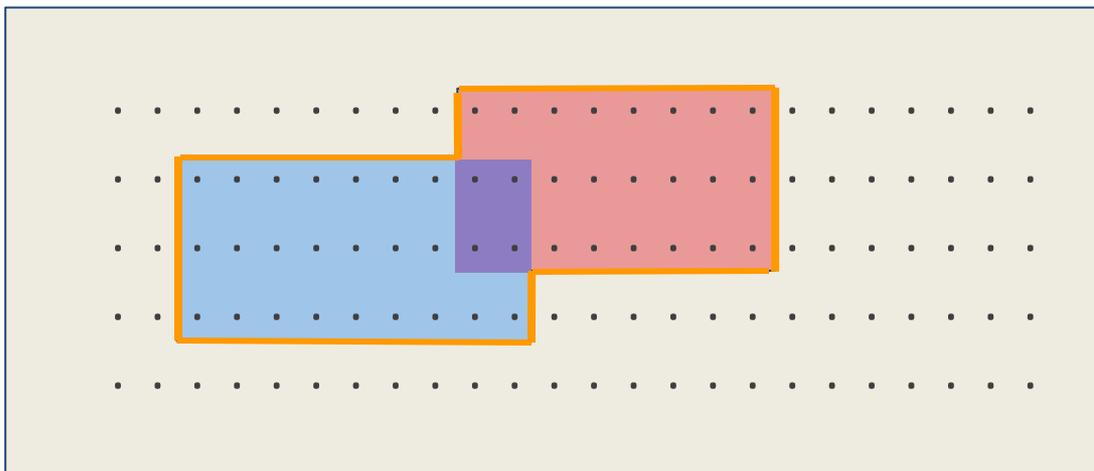
- **T** : It will thunderstorm tonight
- **C** : You will have a car accident this year



- **(T & C)** : It will thunderstorm tonight AND you will have a car accident this year
- **(T v C)** : It will thunderstorm tonight OR you will have a car accident this year
- **~T** : It will not thunderstorm tonight

## Behind the Scenes: Events

- **T** = set of worlds where a **thunderstorm tonight** occurs
- **C** = set of worlds where a **car accident this year** occurs



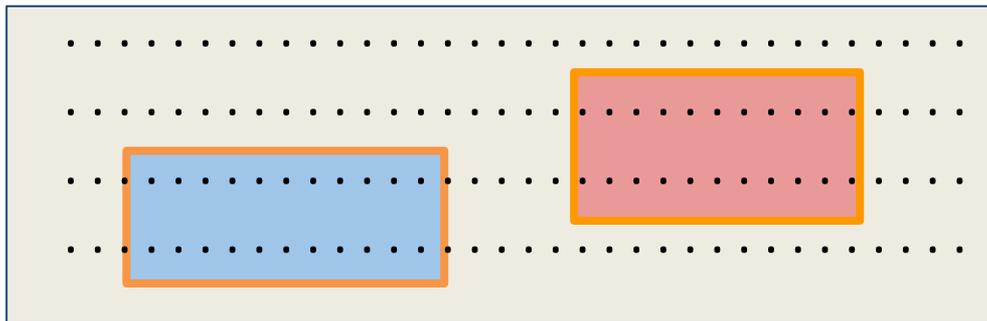
- **$(T \cap C)$**  = set of worlds in both **T** and **C** (i.e., their “intersection”)
- **$(T \cup C)$**  = set of worlds in either **T** or **C** (i.e., their “union”)
- **$T'$**  = set of worlds NOT in **T**

## Notation: Probability

- The probability **that there will be a thunderstorm tonight** = the probability of **a thunderstorm tonight** =  $\Pr(\mathbf{T})$ 
  - $\Pr(\sim\mathbf{T})$ ,  $\Pr(\mathbf{T}\&\mathbf{C})$ ,  $\Pr(\mathbf{T}\vee\mathbf{C})$ ,  $\Pr[\mathbf{T}\&(\mathbf{T}\vee\sim\mathbf{C})]$  all make sense, too
- Probabilities lie between 0 and 1
  - So, for any proposition  $\boldsymbol{\varphi}$ ,  $0 \leq \Pr(\boldsymbol{\varphi}) \leq 1$
- *A necessarily true proposition* has probability 1.
- *An event that must occur* has probability 1.
- We stipulate that the symbol  $\boldsymbol{\Omega}$  (“omega”) stands for an arbitrary necessarily true proposition or event that must occur
  - So,  $\Pr(\boldsymbol{\Omega}) = 1$

## Addition (Mutual Exclusivity)

- Two propositions are **mutually exclusive** iff they can't both be true at once
  - i.e., the set containing them is not consistent
  - i.e.,  $\Pr(\mathbf{P\&Q}) = 0$
  - e.g. “The 2nd coin-flip lands heads” and “The 2nd coin-flip lands tails”
- If **P** and **Q** are mutually exclusive, then  $\Pr(\mathbf{P}) + \Pr(\mathbf{Q}) = \Pr(\mathbf{PvQ})$



## Addition (Example)

Take a fair, 6-sided die.

Let  $\mathbf{E}$  = the die lands with an even number of pips up

For  $1 \leq n \leq 6$ , let  $\mathbf{R}_n$  = the die lands with exactly  $n$  pips up

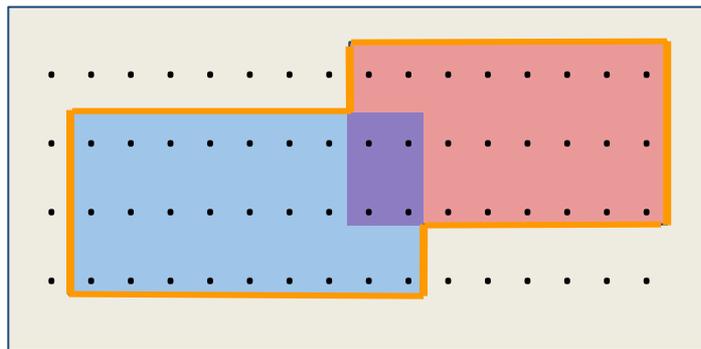
e.g.  $\mathbf{R}_1$  = the die lands with exactly 1 pip up

What's  $\Pr(\mathbf{E})$ ?

$$\begin{aligned}\Pr(\mathbf{E}) &= \Pr(\mathbf{R}_2 \vee \mathbf{R}_4 \vee \mathbf{R}_6) \\ &= \Pr(\mathbf{R}_2) + \Pr(\mathbf{R}_4) + \Pr(\mathbf{R}_6) \quad \leftarrow \text{only because } R_2, R_4, \text{ and } R_6 \text{ are mutually exclusive!} \\ &= \frac{1}{6} + \frac{1}{6} + \frac{1}{6} \\ &= \frac{3}{6} = \frac{1}{2}\end{aligned}$$

## Addition (Mutual Exclusivity)

- Why  $\Pr(P) + \Pr(Q) \neq \Pr(P \vee Q)$ , if **P** and **Q** are not mutually exclusive:
  - You will “double-count” their overlap
  - As a result, you could get  $\Pr(P \vee Q) > 1$  (not possible)



## Addition (Tangent/Hate)

- “The probabilities of mutually exclusive propositions *add up*,” (so, the probabilities of NOT mutually exclusive propositions don’t add up...)
- But probabilities are just numbers between 0 and 1, and any numbers between 0 and 1 can “add up”.
- Suppose **P** and **Q** are NOT mutually exclusive, and **Pr(P)=.75** and **Pr(Q)=.75**
- Then **Pr(P) + Pr(Q) = 1.5**
- That’s correct, but it doesn’t tell you anything meaningful
  - that is, **Pr(P) + Pr(Q) = 1.5  $\neq$  Pr(PvQ)**
- “The probabilities of mutually exclusive propositions *add up to the probability that at least one of them will be true*” is better

## Addition (Teaser)

Actually, for *any* two propositions **P** and **Q**,

$$\Pr(\mathbf{P} \vee \mathbf{Q}) = \Pr(\mathbf{P}) + \Pr(\mathbf{Q}) - \Pr(\mathbf{P} \ \& \ \mathbf{Q})$$

- We just subtract any possible “double counting” we did by adding **Pr(P)** and **Pr(Q)**
- If **P** and **Q** are mutually exclusive, then **Pr(P & Q) = 0**.

## Multiplication (Independence)

- two propositions are **independent** iff the truth of one does not make the truth of the other any more or less probable
  - e.g. “The first card drawn is red” and “The first card drawn is an ace”
  - Drawing a red card doesn’t change the odds of drawing an ace (1/13)
    - Drawing an ace doesn’t change the odds of drawing a red card (1/2)
- if **A** and **B** are independent, then  **$\Pr(A) \times \Pr(B) = \Pr(A \& B)$**

### Example

Let **A** = the die rolls a 1 on the 1st roll

Let **B** = the die rolls a 2 on the 2nd roll

**$\Pr(A\&B) = \Pr(A) \times \Pr(B)$**       <- only because A and B are independent!

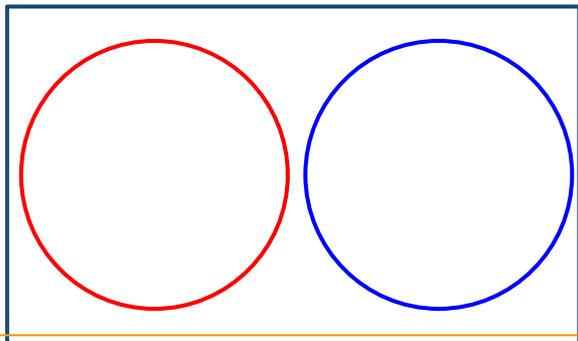
$$= \frac{1}{6} \times \frac{1}{6}$$

$$= \frac{1}{36}$$

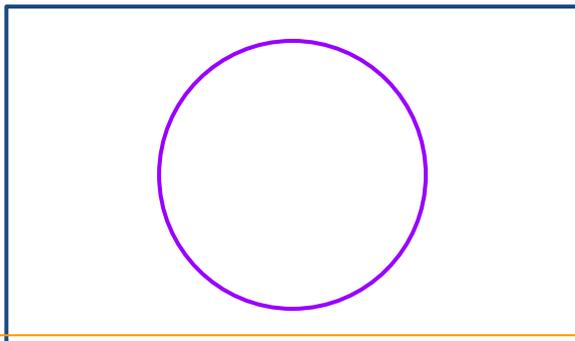
## Multiplication (Independence)

- But wait...consider this “proof” that *no two* propositions are independent!
- For any **A** and **B**, one of these three scenarios obtains:

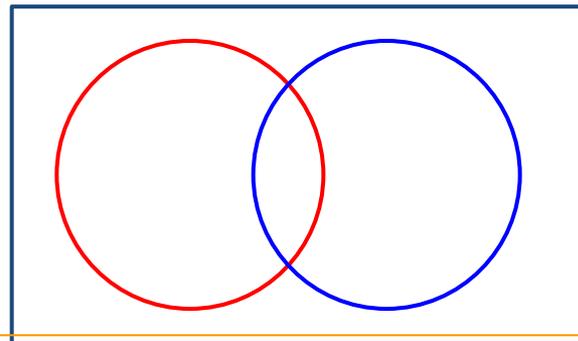
1



2



3



In 1, if A is true, then B must be false. So A and B are not independent.

In 2, if A is true, then B must be true. So A and B are not independent.

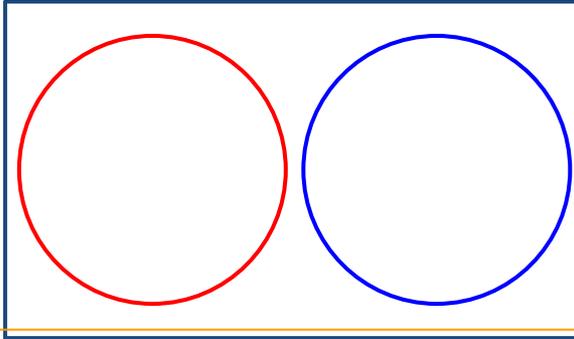
In 3, if A is true, then the probability of B changes. So A and B are not independent.

Where's the flaw in this “proof?”

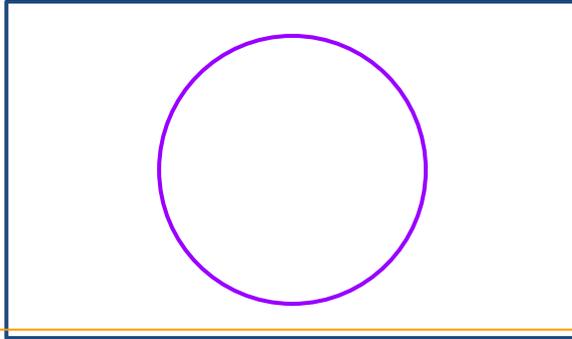
## Multiplication (Independence)

- But wait...consider this “proof” that *all* propositions are independent!
- For any **A** and **B**, one of these three scenarios obtains:

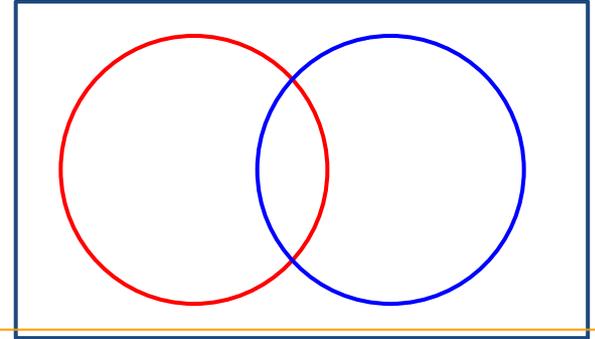
1



2



3



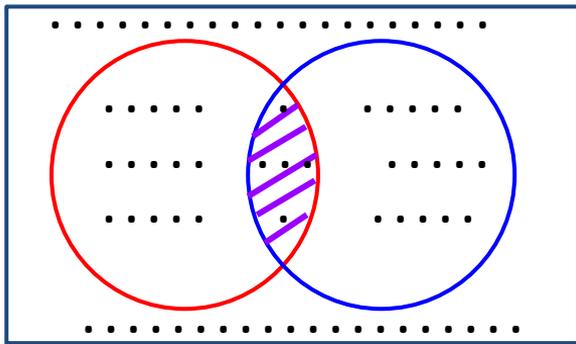
In 1, if A is true, then B must be false. So A and B are not independent.

In 2, if A is true, then B must be true. So A and B are not independent.

~~In 3, if A is true, then the probability of B changes. So A and B are not independent.~~

**If A is true, then the probability of B *MIGHT* stay the same!**

## Multiplication (Independence)



Example

Let there be 80 dots total.

Let **A** contain 20 dots.

Let **B** contain 20 dots.

Let **A&B** contain 5 dots.

$$\Pr(\mathbf{A}) = 20/80 = \frac{1}{4}$$

$$\Pr(\mathbf{B}) = 20/80 = \frac{1}{4}$$

$$\Pr(\mathbf{B} \mid \mathbf{A}) = 5/20 = \frac{1}{4}$$

$$\Pr(\mathbf{A\&B}) = \Pr(\mathbf{A}) \times \Pr(\mathbf{B} \mid \mathbf{A})$$

$$= \Pr(\mathbf{A}) \times \Pr(\mathbf{B})$$

$$= 1/16$$

*<- only because  $\Pr(\mathbf{B} \mid \mathbf{A}) = \Pr(\mathbf{B})$*

$$\Pr(\mathbf{A\&B}) = 5/80 = 1/16$$

## Odd Question #4

To throw a total of 7 with a pair of dice, you have to get a 1 and a 6, or a 2 and a 5, or a 3 and a 4.

To throw a total of 6 with a pair of dice, you have to get a 1 and a 5, or a 2 and a 4, or a 3 and another 3.

With two fair dice, you would expect:

- (a) To throw 7 more frequently than 6
- (b) To throw 6 more frequently than 7
- (c) To throw 6 and 7 equally often

## Odd Question #4

Assuming tosses are independent, there are 36 possible outcomes:

[1,1]	[2,1]	[3,1]	[4,1]	[5,1]	[6,1]
[1,2]	[2,2]	[3,2]	[4,2]	[5,2]	[6,2]
[1,3]	[2,3]	[3,3]	[4,3]	[5,3]	[6,3]
[1,4]	[2,4]	[3,4]	[4,4]	[5,4]	[6,4]
[1,5]	[2,5]	[3,5]	[4,5]	[5,5]	[6,5]
[1,6]	[2,6]	[3,6]	[4,6]	[5,6]	[6,6]

There are **6 mutually exclusive ways to throw a 7**, at  $1/36$  probability each.

$$\begin{aligned}
 \text{So } \Pr(\text{throw } 7 \text{ with } 2 \text{ dice}) &= \Pr([1,6] \vee [2,5] \vee [3,4] \vee [4,3] \vee [5,2] \vee [6,1]) \\
 &= \Pr([1,6]) + \Pr([2,5]) + \Pr([3,4]) + \Pr([4,3]) + \Pr([5,2]) + \Pr([6,1]) \leftarrow \text{only cuz M.E!} \\
 &= 1/36 + 1/36 + 1/36 + 1/36 + 1/36 + 1/36 = 6/36 = 1/6
 \end{aligned}$$

## Odd Question #4

Assuming tosses are independent, there are 36 possible outcomes:

[1,1]	[2,1]	[3,1]	[4,1]	[5,1]	[6,1]
[1,2]	[2,2]	[3,2]	[4,2]	[5,2]	[6,2]
[1,3]	[2,3]	[3,3]	[4,3]	[5,3]	[6,3]
[1,4]	[2,4]	[3,4]	[4,4]	[5,4]	[6,4]
[1,5]	[2,5]	[3,5]	[4,5]	[5,5]	[6,5]
[1,6]	[2,6]	[3,6]	[4,6]	[5,6]	[6,6]

There are **5 mutually exclusive ways to throw a 6**, at  $1/36$  probability each.

So  $\Pr(\text{throw 6 with 2 dice}) = \Pr([1,5] \vee [2,4] \vee [3,3] \vee [4,2] \vee [5,1])$

$$= \Pr([1,5]) + \Pr([2,4]) + \Pr([3,3]) + \Pr([4,2]) + \Pr([5,1]) \leftarrow \text{only cuz M.E!}$$

$$= 1/36 + 1/36 + 1/36 + 1/36 + 1/36 = 5/36$$

## Odd Question #4

To throw a total of 7 with a pair of dice, you have to get a 1 and a 6, or a 2 and a 5, or a 3 and a 4.

To throw a total of 6 with a pair of dice, you have to get a 1 and a 5, or a 2 and a 4, or a 3 and another 3.

With two fair dice, you would expect:

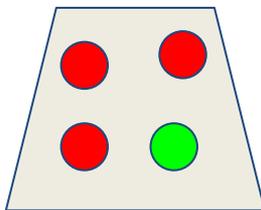
**(a) To throw 7 more frequently than 6** (  $6/36 > 5/36$  )

~~(b) To throw 6 more frequently than 7~~

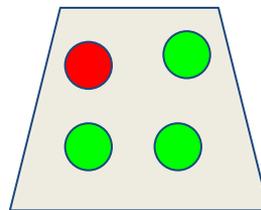
~~(c) To throw 6 and 7 equally often~~

## Compounding Events

Urn 1



Urn 2



Setup: flip a fair coin. If Heads, pull from Urn 1. If Tails, pull from Urn 2.

$R_1$  = Pull red from Urn 1,  $R_2$  = Pull red from Urn 2,  $H$  = Flip heads,  $T$  = Flip tails

What is  $\Pr(\text{pull red})$ ?

$$\Pr(\text{Pull red}) = \Pr( (H \& R_1) \vee (T \& R_2) )$$

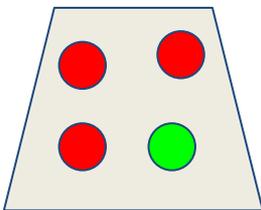
$$= \Pr(H \& R_1) + \Pr(T \& R_2) \quad \leftarrow \text{only because } (H \& R) \text{ and } (T \& R) \text{ are mutually exclusive!}$$

$$= [\Pr(H) \times \Pr(R_1)] + [\Pr(T) \times \Pr(R_2)] \quad \leftarrow \text{only because } H \text{ and } R_1 \text{ ( } T \text{ and } R_2) \text{ are independent}$$

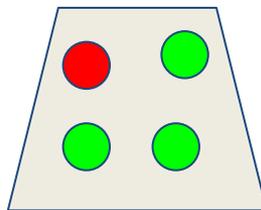
$$= \left[ \frac{1}{2} \times \frac{3}{4} \right] + \left[ \frac{1}{2} \times \frac{1}{4} \right] = \frac{3}{8} + \frac{1}{8} = \frac{4}{8} = \frac{1}{2}$$

## Compounding Events

Urn 1



Urn 2



What if we flip the coin, then pull 2 balls *with replacement*?

Let  $R_1$  = Red on 1st pull,  $R_2$  = Red on 2nd pull

What's  $\Pr(R_1 \ \& \ R_2)$ ?

$X$  = Flip heads ( $\frac{1}{2}$ ), then pull red from Urn 1 ( $\frac{3}{4}$ ), replace, then pull red from Urn 1 ( $\frac{3}{4}$ )

$Y$  = Flip tails ( $\frac{1}{2}$ ), then pull red from Urn 2 ( $\frac{1}{4}$ ), replace, then pull red from Urn 2 ( $\frac{1}{4}$ )

$$\Pr(R_1 \ \& \ R_2) = \Pr(X \vee Y)$$

$$= \Pr(X) + \Pr(Y)$$

*<- only because X and Y are mutually exclusive!*

$$= \left[ \frac{1}{2} \times \frac{3}{4} \times \frac{3}{4} \right] + \left[ \frac{1}{2} \times \frac{1}{4} \times \frac{1}{4} \right] = \frac{9}{32} + \frac{1}{32} = \frac{10}{32} = \frac{5}{16}$$

## Recap

- Two propositions are **mutually exclusive** iff they can't both be true at once
- If **A** and **B** are mutually exclusive, then  $\Pr(\mathbf{A}) + \Pr(\mathbf{B}) = \Pr(\mathbf{A} \vee \mathbf{B})$
- This follows from  $\Pr(\mathbf{A} \vee \mathbf{B}) = \Pr(\mathbf{A}) + \Pr(\mathbf{B}) - \Pr(\mathbf{A} \ \& \ \mathbf{B})$ , where  $\Pr(\mathbf{A} \ \& \ \mathbf{B}) = 0$
  
- Two propositions are **independent** iff the truth of one does not make the truth of the other any more or less probable
- If **A** and **B** are independent, then  $\Pr(\mathbf{A}) \times \Pr(\mathbf{B}) = \Pr(\mathbf{A} \ \& \ \mathbf{B})$
- This follows from  $\Pr(\mathbf{A} \ \& \ \mathbf{B}) = \Pr(\mathbf{A}) \times \Pr(\mathbf{B} \mid \mathbf{A})$ , where  $\Pr(\mathbf{B} \mid \mathbf{A}) = \Pr(\mathbf{B})$

### Group Exercises

*Probability & Inductive Logic* p. 45, #2–4