CONDITIONAL PROBABILITY

DISCRETE STRUCTURES II

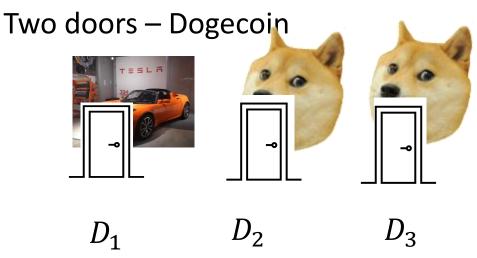
DARRYL HILL

BASED ON THE TEXTBOOK:

DISCRETE STRUCTURES FOR COMPUTER SCIENCE: COUNTING, RECURSION, AND PROBABILITY

BY MICHIEL SMID

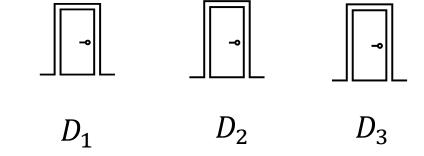
One door – Tesla Roadster



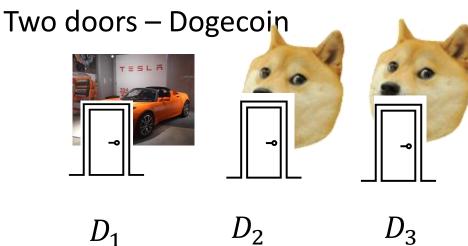
Three doors, and you do not know what is behind any of them.

The game is as follows:

1. Choose uniformly random door (but don't open it, ex. D_1)



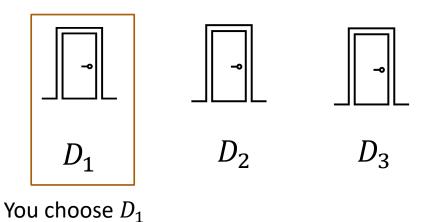
One door – Tesla Roadster



Three doors, and you do not know what is behind any of them.

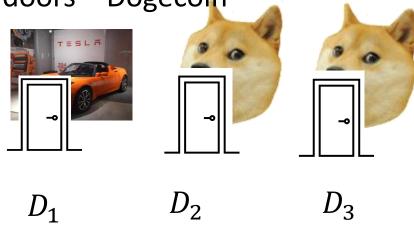
The game is as follows:

- 1. Choose uniformly random door (but don't open it, ex. D_1)
- 2. Out of the unselected doors (D_2 and D_3) Monty Hall opens one door with Dogecoin (ex. D_3).



One door – Tesla Roadster

Two doors – Dogecoin



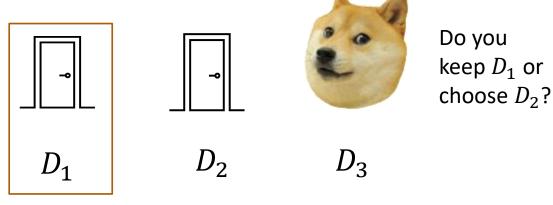
Three doors, and you do not know what is behind any of them.

The game is as follows:

- 1. Choose uniformly random door (but don't open it, ex. D_1)
- 2. Out of the unselected doors (D_2 and D_3) Monty Hall opens one door with Dogecoin (ex. D_3).
- 3. Make decision keep your door D_1 or open other door D_2 ?

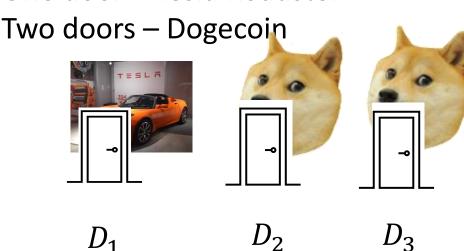
What do you do?

Is there a superior strategy?



Monty shows you D_3

One door – Tesla Roadster



- 1. Choose uniformly random door (but don't open it, ex. D_1)
- 2. Monty Hall opens one door with Dogecoin (ex. D_3).
- 3. Make decision keep your door D_1 or open other door D_2 ?

What sort of strategy should we use?

One thought - Monty shows you the Doge, then probability of car being behind each remaining door is ½

This is wrong – why?

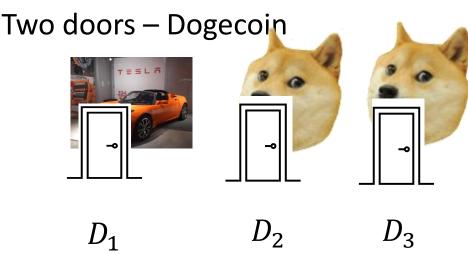
What do we know?

Monty Hall knows where the Tesla is.

Monty Hall will never show you the door hiding the Tesla.

He will always show you a door hiding Doge.

One door – Tesla Roadster



- 1. Choose uniformly random door (but don't open it, ex. D_1)
- 2. Monty Hall opens one door with Dogecoin (ex. D_3).
- 3. Make decision keep your door D_1 or open other door D_2 ?

Monty is actually giving you information because his selection is not random.

Claim: After Monty reveals Dogecoin, it is always better to switch doors.

Let's try this strategy:

The first door we pick has something random behind it.

What happens if we select a door with Dogecoin?

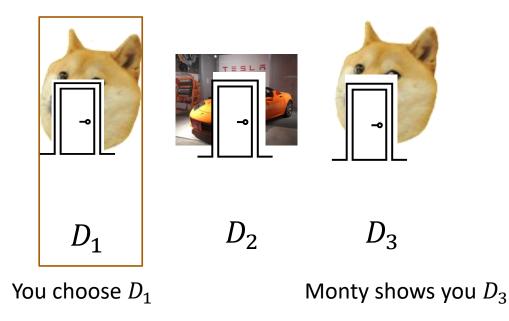
One door – Tesla Roadster Two doors – Dogecoin

- 1. Choose uniformly random door (but don't open it, ex. D_1)
- 2. Monty Hall opens one door with Dogecoin (ex. D_3).
- 3. Make decision keep your door D_1 or open other door D_2 ?

Claim: After Monty reveals Dogecoin, it is always better to switch doors.

Assume our first selection is Dogecoin.

Monty reveals D_2 or D_3 . But of course he must show D_3 .



One door – Tesla Roadster Two doors – Dogecoin

- 1. Choose uniformly random door (but don't open it, ex. D_1)
- 2. Monty Hall opens one door with Dogecoin (ex. D_3).
- 3. Make decision keep your door D_1 or open other door D_2 ?

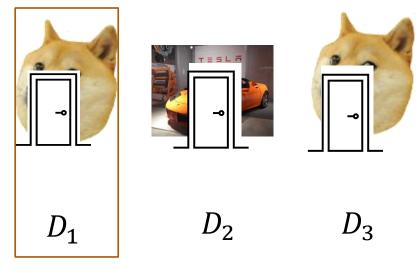
Claim: After Monty reveals Dogecoin, it is always better to switch doors.

Assume our first selection is Dogecoin.

Monty reveals D_2 or D_3 . But of course he must show D_3 .

Now we switch:

We always win the Tesla if we first select Dogecoin



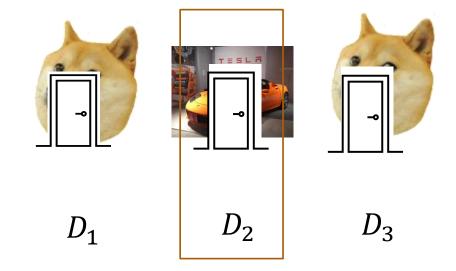
One door – Tesla Roadster Two doors – Dogecoin

- 1. Choose uniformly random door (but don't open it, ex. D_1)
- 2. Monty Hall opens one door with Dogecoin (ex. D_3).
- 3. Make decision keep your door D_1 or open other door D_2 ?

Claim: After Monty reveals Dogecoin, it is always better to switch doors.

Assume our first selection is Tesla.

Monty reveals D_1 or D_3 . In this case he can choose either.



One door – Tesla Roadster Two doors – Dogecoin

- 1. Choose uniformly random door (but don't open it, ex. D_1)
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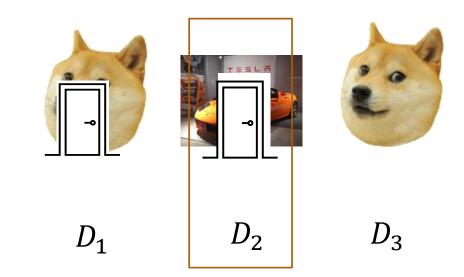
Claim: After Monty reveals Dogecoin, it is always better to switch doors.

Assume our first selection is Tesla.

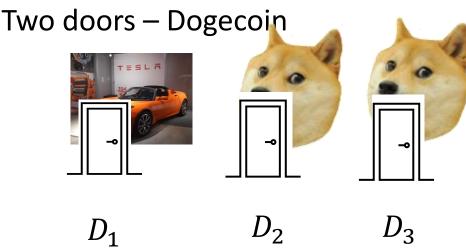
Monty reveals D_1 or D_3 . In this case he can choose either.

We switch.

We always find Dogecoin.



One door – Tesla Roadster



- 1. Choose uniformly random door (but don't open it, ex. D_1)
- 2. Monty Hall opens one door with Dogecoin (ex. D_3).
- 3. Make decision keep your door D_1 or open other door D_2 ?

If we always switch doors:

Win Tesla ↔ door chosen in step 1 has Dogecoin.

$$Pr(first door has Doge) = \frac{2}{3}$$

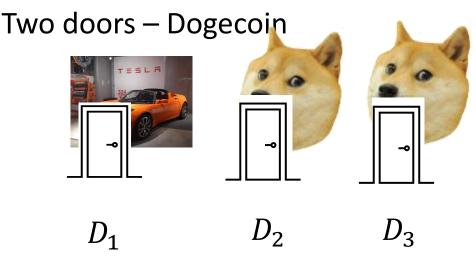
Win Dogecoin ↔ door chosen in step 1 has Tesla.

$$Pr(first door has Tesla) = \frac{1}{3}$$

What is behind the door selected in step 1 is random. So what are the probabilities?

Always switching gives us probability $\frac{2}{3}$ of winning

One door – Tesla Roadster



- 1. Choose uniformly random door (but don't open it, ex. D_1)
- 2. Monty Hall opens one door with Dogecoin (ex. D_3).
- 3. Make decision keep your door D_1 or open other door D_2 ?

By knowing that Monty always reveals Doge, we arrived at different probabilities than we would suspect.

$$Pr(first door has Doge) = \frac{2}{3}$$

$$Pr(first door has Tesla) = \frac{1}{3}$$

This is conditional probability, which we will formalize.

Anil's Kids

Anil Maheshwari has 2 kids.

We are told that at least 1 of his kids is a boy.

When each child was born:

$$Pr(child is a boy) = \frac{1}{2}$$

$$Pr(child is a girl) = \frac{1}{2}$$

Given that at least 1 kid is a boy, what is the Pr(both are boys) = ?



We know 1 is a boy, so guess might be that the probability other is a boy is ½.

But again, we are given some (incomplete) information, and we should account for it.

Anil's Kids

Anil Maheshwari has 2 kids, at least 1 is a boy.

Pr(child is a boy) = $\frac{1}{2}$ Pr(child is a girl) = $\frac{1}{2}$

Pr(both are boys) = ?



We know one is a boy, but we don't know which one.

Let's look at the sample space S: Anil has 2 kids.

All the possible combinations of 2 kids is

$$S = \{bb, bg, gb, gg\}$$

The first character represents the older child.

The second character represents the younger child.

Each of these outcomes has equal probability.

Our extra information – at least 1 is a boy – shrinks the sample space

Anil's Kids

Anil Maheshwari has 2 kids, at least 1 is a boy.

Pr(child is a boy) =
$$\frac{1}{2}$$

Pr(child is a girl) = $\frac{1}{2}$

Pr(both are boys) = ?



$$S = \{bb, bg, gb, gg\}$$

What are the outcomes of S that have at least 1 boy?

$$S' = \{bb, bg, gb\}$$

We know that the outcome cannot be gg.

Now we have a sample space S' and an event $BB = \{bb\}$. What is the probability of BB?

If we said the *oldest* is a boy, then
$$S = \{bb, bg\}$$

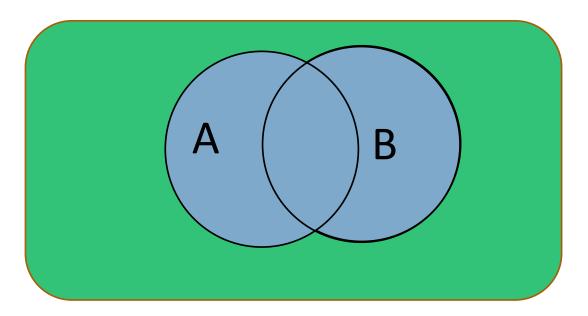
$$\Pr(BB) = \frac{|BB|}{|S'|}$$

$$=\frac{1}{3}$$

Events A, B, Pr(B) > 0

Pr(A|B) = probability of A given B

$$Pr(A|B) = \frac{Pr(A \cap B)}{Pr(B)}$$



One way to think of it is since we are told B is true, the set B becomes the new sample space.

Then Pr(A|B) is the probability of selecting an element of A from the sample space B.

Note that if we have uniform probability, then this is the probability of event $A \cap B$ occurring in the sample space B.

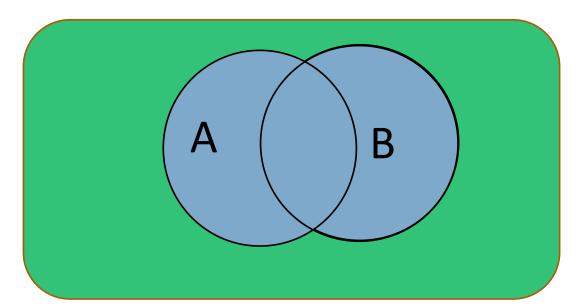
$$\Pr(A|B) = \frac{\Pr(A \cap B)}{\Pr(B)} = \frac{|A \cap B|/|S|}{|B|/|S|} = \frac{|A \cap B|}{|B|}$$

This does NOT generalize (but can be useful).

Events $A, B, \Pr(B) > 0$

Pr(A|B) = probability of A given B

$$Pr(A|B) = \frac{Pr(A \cap B)}{Pr(B)}$$



$$Pr(A|A) = \frac{Pr(A \cap A)}{Pr(A)} = \frac{Pr(A)}{Pr(A)} = 1$$

Anil's kids:

Sample space $S = \text{two kids} = \{gg, gb, bg, bb\}$

Event $B = \text{at least one boy} = \{gb, bg, bb\}$

Event $A = both are boys = \{bb\}$

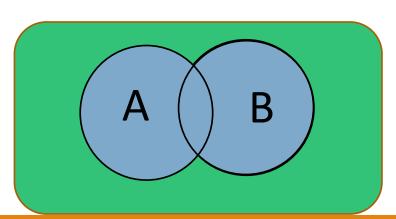
$$Pr(A|B) = \frac{Pr(A \cap B)}{Pr(B)}$$
$$= \frac{1/4}{3/4} = \frac{1}{3}$$

Events A, B, Pr(B) > 0

Pr(A|B) = probability of A given B

$$Pr(A|B) = \frac{Pr(A \cap B)}{Pr(B)}$$

Is there a relationship between Pr(A|B) and Pr(B|A)?



Roll fair die: $S = \{1, 2, 3, 4, 5, 6\}$

 $A = "result is 3" = {3}$

 $B = \text{"result is odd"} = \{1, 3, 5\}$

 $C = \text{"result is prime"} = \{2, 3, 5\}$

$$\Pr(A|B) = \frac{\Pr(A \cap B)}{\Pr(B)} = \frac{\frac{1}{6}}{\frac{3}{6}} = \frac{1}{3}$$

$$Pr(B|A) = \frac{Pr(A \cap B)}{Pr(A)} = \frac{1/6}{1/6} = 1$$

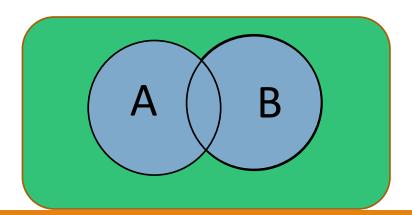
In general $Pr(A|B) \neq Pr(B|A)$

Events $A, B, \Pr(B) > 0$

Pr(A|B) = probability of A given B

$$Pr(A|B) = \frac{Pr(A \cap B)}{Pr(B)}$$

Is there a relationship between Pr(C|B) and $Pr(C|\overline{B})$?



Roll fair die: $S = \{1, 2, 3, 4, 5, 6\}$

$$A = \text{"result is 3"} = \{3\}$$

$$B = \text{"result is odd"} = \{1, 3, 5\}$$

$$C = \text{"result is prime"} = \{2, 3, 5\}$$

$$\overline{B}$$
 = "result is even" = {2, 4, 6}

$$\Pr(C|\bar{B}) = \frac{\Pr(C \cap \bar{B})}{\Pr(\bar{B})} = \frac{1/6}{3/6} = \frac{1}{3}$$

$$Pr(C|B) = \frac{Pr(C \cap B)}{Pr(B)} = \frac{2/6}{3/6} = \frac{2}{3}$$

$$Pr(C|\overline{B}) + Pr(C|B) = \frac{1}{3} + \frac{2}{3} = 1$$

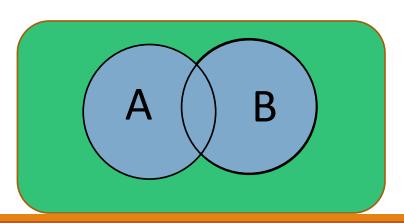
Is this always true?

Events $A, B, \Pr(B) > 0$

Pr(A|B) = probability of A given B

$$Pr(A|B) = \frac{Pr(A \cap B)}{Pr(B)}$$

Is there a relationship between Pr(C|B) and $Pr(C|\overline{B})$?



Roll fair die: $S = \{1, 2, 3, 4, 5, 6\}$

$$A = \text{"result is 3"} = \{3\}$$
 $B = \text{"result is odd"} = \{1, 3, 5\}$
 $C = \text{"result is prime"} = \{2, 3, 5\}$
 $\bar{B} = \text{"result is even"} = \{2, 4, 6\}$
 $\bar{A} = \{1, 2, 4, 5, 6\}$

$$Pr(C|A) + Pr(C|\bar{A}) = \frac{Pr(C \cap A)}{Pr(A)} + \frac{Pr(C \cap \bar{A})}{Pr(\bar{A})}$$

$$= \frac{1/6}{1/6} + \frac{2/6}{5/6}$$

$$= \frac{1}{1} + \frac{2}{5} > 1$$

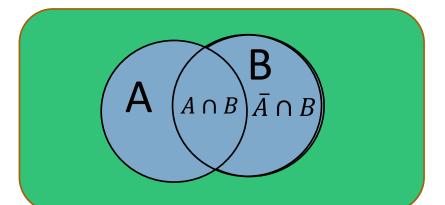
Not true in general.

Events $A, B, \Pr(B) > 0$

Pr(A|B) = probability of A given B

$$Pr(A|B) = \frac{Pr(A \cap B)}{Pr(B)}$$

Is there a relationship between Pr(A|B) and $Pr(\bar{A}|B)$?



Roll fair die: $S = \{1, 2, 3, 4, 5, 6\}$

$$A = \text{"result is 3"} = \{3\}$$
 $B = \text{"result is odd"} = \{1, 3, 5\}$
 $C = \text{"result is prime"} = \{2, 3, 5\}$
 $\bar{B} = \text{"result is even"} = \{2, 4, 6\}$
 $\bar{A} = \{1, 2, 4, 5, 6\}$

$$Pr(A|B) + Pr(\bar{A}|B)$$

$$= \frac{Pr(A \cap B)}{Pr(B)} + \frac{Pr(\bar{A} \cap B)}{Pr(B)}$$

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

$$= \frac{1}{3} + \frac{2}{3} = 1$$
 always

Anil has 2 kids.



1 kid is a boy who was born on Sunday.

What is the probability that Anil has 2 boys?

The first thing we should do is determine the sample space.

The sample space is all combinations of 2 children. But now the children have 2 "stats".

Each child has a gender and they were born on some day of the week.

We can count *S* using the Product Rule, by building each individual element.

$$S = \{(g_1, d_1, g_2, d_2) |$$

for $i \in \{1,2\}$, $g_i = \text{gender of child } i$ $d_i = \text{day of the week child } i$ was born on

where

$$\begin{split} g_i &\in \{\text{girl, boy}\} \\ d_i &\in \{\text{Mon, Tues, Wed, Thurs, Fri, Sat, Sun}\} \, \} \end{split}$$

Thus $(girl, Fri) \in S$, $(boy, Sun) \in S$, etc.

Anil has 2 kids. 1 kid is a boy who was born on Sunday.

What is the probability that Anil has 2 boys?

$$S = \{(g_1, d_1, g_2, d_2) | g_i \in \{\text{girl, boy}\},\$$

$$d_i \in \{\text{Mon, Tues, Wed, Thurs, Fri, Sat, Sun}\} \}$$

2 ways to choose g_1

7 ways to choose d_1

2 ways to choose g_2

7 ways to choose d_2

Thus there are $2 \cdot 7 \cdot 2 \cdot 7 = 196$ elements in S, or |S| = 196.

Let A be the event that Anil has 2 boys.

Let B be the event that Anil has ≥ 1 boy born on Sunday.

$$Pr(A|B) = \frac{Pr(A \cap B)}{Pr(B)}$$

$$\Pr(B) = \frac{|B|}{|S|}$$

 $B = B_1 \cup B_2$ where $B_1 = 1$ st kid is a boy born on Sunday $B_2 = 2$ nd kid is a boy born on Sunday

Anil has 2 kids. 1 kid is a boy who was born on Sunday.

What is the probability that Anil has 2 boys?

$$S = \{(g_1, d_1, g_2, d_2) | g_i \in \{\text{girl, boy}\},\$$

$$d_i \in \{\text{Mon, Tues, Wed, Thurs, Fri, Sat, Sun}\} \}$$

$$|S| = 196$$

Let A = Anil has 2 boys.

Let $B = \text{Anil has} \ge 1$ boy born on Sunday.

 $B_1 = 1^{st}$ kid is a boy born on Sunday

$$\begin{split} B_1 &= \{\, (\text{boy}, \text{Sun}, g_2, d_2) | \\ g_2 &\in \{ \text{girl}, \text{boy} \}, \\ d_2 &\in \{ \text{Mon}, \text{Tues}, \text{Wed}, \text{Thurs}, \text{Fri}, \text{Sat}, \text{Sun} \} \} \end{split}$$

How many elements in B_1 ?

1 way to choose g_1

1 way to choose d_1

2 ways to choose g_2

7 ways to choose d_2

$$|B_1| = 1 \cdot 1 \cdot 2 \cdot 7 = 14$$

Anil has 2 kids. 1 kid is a boy who was born on Sunday.

What is the probability that Anil has 2 boys?

$$S = \{(g_1, d_1, g_2, d_2) | g_i \in \{\text{girl, boy}\},\$$

$$d_i \in \{\text{Mon, Tues, Wed, Thurs, Fri, Sat, Sun}\} \}$$

$$|S| = 196$$

Let A = Anil has 2 boys.

Let $B = \text{Anil has} \ge 1$ boy born on Sunday.

 $B_2 = 2^{\text{nd}}$ kid is a boy born on Sunday

$$B_2 = \{ (g_1, d_1, \mathsf{boy}, \mathsf{Sun}) | \\ g_1 \in \{ \mathsf{girl}, \mathsf{boy} \}, \\ d_1 \in \{ \mathsf{Mon}, \mathsf{Tues}, \mathsf{Wed}, \mathsf{Thurs}, \mathsf{Fri}, \mathsf{Sat}, \mathsf{Sun} \} \}$$

How many elements in B_2 ?

2 ways to choose g_1 7 ways to choose d_1 1 ways to choose g_2 1 ways to choose d_2

$$|B_2| = 2 \cdot 7 \cdot 1 \cdot 1 = 14$$

Anil has 2 kids. 1 kid is a boy who was born on Sunday.

What is the probability that Anil has 2 boys?

$$S = \{(g_1, d_1, g_2, d_2) | g_i \in \{\text{girl, boy}\},\$$

$$d_i \in \{\text{Mon, Tues, Wed, Thurs, Fri, Sat, Sun}\} \}$$

$$|S| = 196$$

Let A = Anil has 2 boys.

Let $B = \text{Anil has} \ge 1$ boy born on Sunday.

 $B = \text{Anil has} \ge 1 \text{ boy born on Sunday}$

 $B_1 = 1^{st}$ kid is a boy born on Sunday $B_2 = 2^{nd}$ kid is a boy born on Sunday

$$B = B_1 \cup B_2$$

Thus
$$|B| = |B_1| + |B_2| - |B_1 \cap B_2|$$

$$B_1 \cap B_2 = \{ \text{ (boy, Sun, boy, Sun)} \}$$

How many elements in $B_1 \cap B_2$?

Anil has 2 kids. 1 kid is a boy who was born on Sunday.

What is the probability that Anil has 2 boys?

$$S = \{(g_1, d_1, g_2, d_2) | g_i \in \{\text{girl, boy}\},\$$

$$d_i \in \{\text{Mon, Tues, Wed, Thurs, Fri, Sat, Sun}\} \}$$

$$|S| = 196$$

Let A = Anil has 2 boys.

Let $B = \text{Anil has} \ge 1$ boy born on Sunday.

$$B_1 = 1^{st}$$
 kid is a boy born on Sunday $B_2 = 2^{nd}$ kid is a boy born on Sunday

How many elements in $B_1 \cap B_2$?

= 27

$$B_1 \cap B_2 = \{ \text{(boy, Sun, boy, Sun)} \}$$

 $|B_1 \cap B_2| = 1$
 $B = B_1 \cup B_2$
 $|B| = |B_1| + |B_2| - |B_1 \cap B_2|$
 $= 14 + 14 - 1$

Anil has 2 kids. 1 kid is a boy who was born on Sunday.

What is the probability that Anil has 2 boys?

$$S = \{(g_1, d_1, g_2, d_2) | g_i \in \{\text{girl, boy}\},\$$

$$d_i \in \{\text{Mon, Tues, Wed, Thurs, Fri, Sat, Sun}\} \}$$

$$|S| = 196$$

Let $A = \text{Anil has 2 boys.}$
Let $B = \text{Anil has} \ge 1$ boy born on Sunday.

$$Pr(A|B) = \frac{Pr(A \cap B)}{Pr(B)}$$

$$A \cap B = \text{has 2 boys and}$$

 $\geq 1 \text{ boy was born on Sunday}$

$$A \cap B = AB_1 \cup AB_2$$

Where:

$$AB_1 = 2$$
 boys, first born Sun $AB_2 = 2$ boys, second born Sun

Anil has 2 kids. 1 kid is a boy who was born on Sunday.

What is the probability that Anil has 2 boys?

$$S = \{(g_1, d_1, g_2, d_2) | g_i \in \{\text{girl, boy}\},\$$

$$d_i \in \{\text{Mon, Tues, Wed, Thurs, Fri, Sat, Sun}\} \}$$

$$|S| = 196$$

Let A = Anil has 2 boys.

Let $B = \text{Anil has} \ge 1$ boy born on Sunday.

$$Pr(A|B) = \frac{Pr(A \cap B)}{Pr(B)}$$

 $AB_1 = 2$ boys, first born Sun

 $AB_1 = \{ \text{(boy, Sun, boy, } d_2) | d_2 \in \{ \text{Mon, Tues, Wed, Thurs, Fri, Sat, Sun} \} \}$

How many elements in AB_1 ?

1 way to choose g_1

1 way to choose d_1

1 way to choose g_2

7 ways to choose d_2

$$|AB_1| = 1 \cdot 1 \cdot 1 \cdot 7 = 7$$

Anil has 2 kids. 1 kid is a boy who was born on Sunday.

What is the probability that Anil has 2 boys?

$$S = \{(g_1, d_1, g_2, d_2) | g_i \in \{\text{girl, boy}\},\$$

$$d_i \in \{\text{Mon, Tues, Wed, Thurs, Fri, Sat, Sun}\} \}$$

$$|S| = 196$$

Let A = Anil has 2 boys.

Let $B = \text{Anil has} \ge 1$ boy born on Sunday.

$$Pr(A|B) = \frac{Pr(A \cap B)}{Pr(B)}$$

 $AB_2 = 2$ boys, second born Sun

$$AB_2 = \{ \text{(boy, } d_1, \text{boy, Sun)} |$$

 $d_1 \in \{ \text{Mon, Tues, Wed, Thurs, Fri, Sat, Sun} \} \}$

How many elements in AB_2 ?

1 way to choose g_1

7 ways to choose d_1

1 way to choose g_2

1 way to choose d_2

$$|AB_2| = 1 \cdot 7 \cdot 1 \cdot 1 = 7$$

Anil has 2 kids. 1 kid is a boy who was born on Sunday.

What is the probability that Anil has 2 boys?

$$S = \{(g_1, d_1, g_2, d_2) | g_i \in \{\text{girl, boy}\},\$$

$$d_i \in \{\text{Mon, Tues, Wed, Thurs, Fri, Sat, Sun}\} \}$$

$$|S| = 196$$

Let A = Anil has 2 boys.

Let $B = \text{Anil has} \ge 1$ boy born on Sunday.

$$Pr(A|B) = \frac{Pr(A \cap B)}{Pr(B)}$$

$$AB_1 = 2$$
 boys, first born Sun $AB_2 = 2$ boys, second born Sun

$$AB_1 \cap AB_2 = \{ \text{(boy, Sun, boy, Sun)} \}$$

How many elements in $AB_1 \cap AB_2$?

$$|AB_1 \cap AB_2| = 1$$

$$A \cap B = AB_1 \cup AB_2$$

$$|AB_1 \cup AB_2| = |AB_1| + |AB_2| - |AB_1 \cap AB_2|$$

= 7 + 7 - 1
= 13

Anil has 2 kids. 1 kid is a boy who was born on Sunday.

What is the probability that Anil has 2 boys?

$$S = \{(g_1, d_1, g_2, d_2) | g_i \in \{\text{girl, boy}\},\$$

$$d_i \in \{\text{Mon, Tues, Wed, Thurs, Fri, Sat, Sun}\} \}$$

$$|S| = 196$$

Let A = Anil has 2 boys.

Let $B = \text{Anil has} \ge 1$ boy born on Sunday.

$$Pr(A|B) = \frac{Pr(A \cap B)}{Pr(B)}$$

$$= \frac{|A \cap B|/|S|}{|B|/|S|}$$

$$=\frac{13/196}{27/196}$$

$$=\frac{13}{27}\approx 0.48$$