

# Probabilistic systems analysis & applied probability

## 1. Probability models and axioms

"noise is random"

"manages - customer demand, stock market"

### Probability:

"framework for reasoning about uncertainty"

### Probabilistic model:

→ Probability axioms

→ Sample space

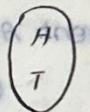
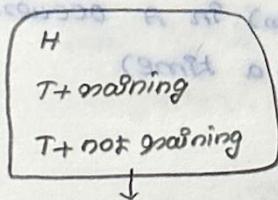
\* list of (set) all possible outcomes



\* mutually exclusive: If H happens, T - don't

\* collectively exhaustive: One case from set alone.

### Likelihood



↳ usually.

If you have

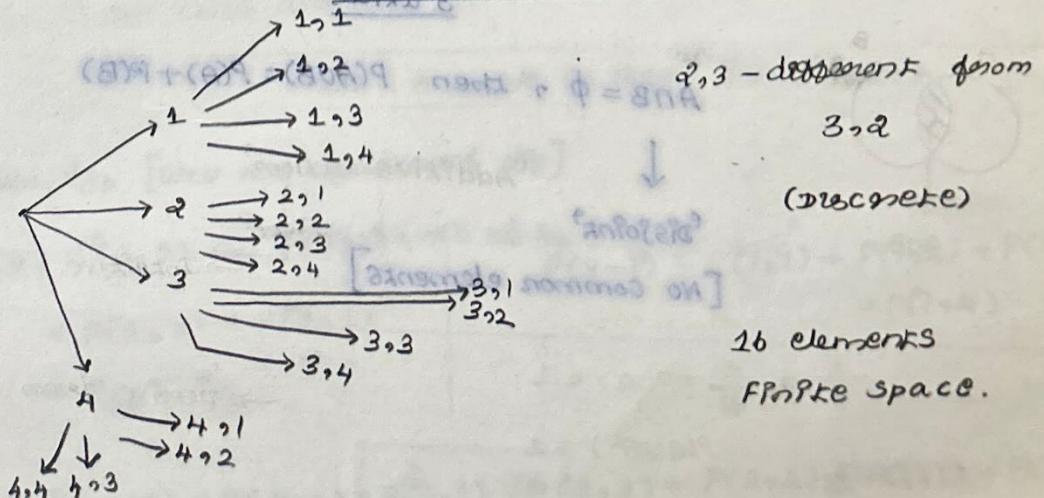
superstition belief

grain has effect on coins

go with it (normally we don't)

"choose details relevant, non-negligible" - Judgement (select correct sample space).

### Tetrahedral die (dice) (1 experiment)



"Visually - sequential (tree) description"

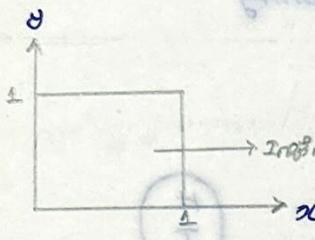
2nd attempt

|   |         |         |         |
|---|---------|---------|---------|
| 4 | 2,0,0,0 | 2,0,0,0 | 2,0,0,0 |
| 3 | 0,2,3   | 0,2,3   | 0,2,3   |
| 2 | 0,3,2   | 0,3,2   | 0,3,2   |
| 1 | 3,2,0   | 3,2,0   | 3,2,0   |

1st attempt

'finite'

### Infinite sample space

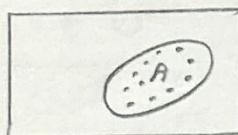


(Darts)

→ Infinitely many points.

$\infty$  outcomes → Sample Space  
one point (probability) =  $\frac{1}{\infty} = 0$

### Subsets



Event A: A point (random) in A occurs.  
(single outcome at a time)

Ground rules:

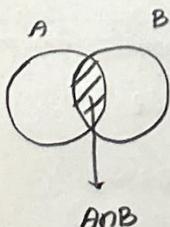
1-axiom \*  $0 \leq P(A) \leq 1$  [convention]

\*  $P(A) \geq 1$  [non-negative] - less than 1. (or equal)

2-axiom \*  $P(\Omega) = 1$  [entire axiom - Sample Space]

∴ Collectively exhaustive - outcome must be from sample space.

### 3 axiom



$A \cap B = \emptyset$ , then  $P(A \cup B) = P(A) + P(B)$

↓ 'Additive axiom'

'Disjoint'

[No common elements]

→ Intuitive.

$$P(\Omega) = 1$$

→ 'positive from axiom 3'

$$P(A \cup A^c) = 1$$

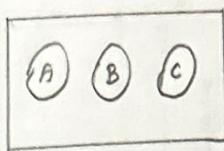
'disjoint'

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

$$\boxed{P(A) = 1 - P(A^c)}$$

'mutually'

$$P(A) = 1 - P(A^c) \leq 1 \rightarrow \text{Non-negative.}$$



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

$$\therefore P(A \cup B) \cup C = P(A \cup B) + P(C)$$

$$= P(A) + P(B) + P(C)$$

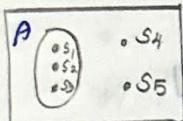
$\therefore A \cup B$  and  $C$  are disjoint

$A$  and  $B$  are disjoint.

$A_1, \dots, A_n$  are disjoint

$$P(A_1 \cup \dots \cup A_n) = P(A_1) + \dots + P(A_n)$$

Special case (finite set)



$$P(\{S_1, S_2, S_3, \dots, S_k\}) = P(\{S_1\} + \dots + P\{S_k\})$$

\* Probability = union of single element sets?

$$\begin{aligned} P(A) &= P(\{S_1\}) + P(\{S_2\}) + P(\{S_3\}) \\ &= P(S_1) + P(S_2) + P(S_3) \end{aligned}$$

$\therefore$  Single element set.

Conclusion:

\* The total prob of a finite collection of possible outcomes, is equal to the prob of individual elements.

We don't do assign probabilities to every subset.



\* Some (more cuts - more subsets)

\* weird cuts - hard to imagine - doesn't satisfy prob axiom - are also available.

Die - Example (4 sides, rolled twice)

\* Same prob:  $\frac{1}{16}$  [well manufactured die]

$$\begin{aligned} P(x, y) &= P((1, 1) \text{ or } (1, 2)) \\ &= P(1, 1) + P(1, 2) \\ &= \frac{1}{2} \cdot \frac{1}{2} = \frac{1}{8} \end{aligned}$$

$$\begin{aligned} P(x=1) &= P(1, 1) + P(1, 2) + P(1, 3) \\ &\quad + P(1, 4) \\ &= \frac{1}{16} + \frac{1}{16} + \frac{1}{16} + \frac{1}{16} = \frac{1}{4} \end{aligned}$$

$$\begin{aligned} P(x+y \text{ is odd}) &= P(1, 2) + P(2, 1) + P(2, 3) + P(3, 2) + P(4, 1) + P(1, 4) \\ &\quad + P(4, 3) + P(3, 4) \\ &= \frac{8}{16} = \frac{1}{2} \end{aligned}$$

$$P(\min(x, y) = 2) = P(2, 2) + P(2, 3) + P(2, 4) + P(3, 2) + P(4, 2)$$

$$= \frac{5}{16}$$

discrete uniform law

$$(0.1)^4 + (0.1)^4 + (0.1)^4 = (0.1)^4 \cdot 3$$

(Eventually 16 likely outcomes)

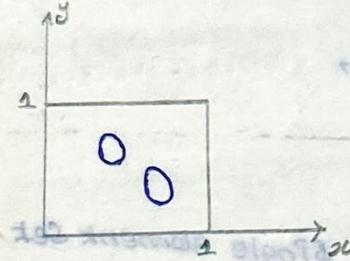
Then,

$$P(A) = \frac{\text{no. of elements of } A}{\text{Total number of sample points}} = \frac{m}{n}$$

computing probability = count.

continuous uniform law

Area of the subset: probability law



two random numbers  $[0, 1]$

uniform numbers (law): probability  $= \text{Area} = 1/2$

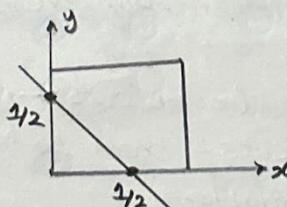
Assume: Equal area: Equal probability.

$$P(x, y) = P(0.5, 0.3) = \frac{1}{\infty} = 0$$

$$P(x+y \geq 1/2)$$

$$x=0, y=1/2$$

$$y=0, x=1/2$$



$$P(x+y \geq 1/2) = \frac{1}{2} \times b \times h = \frac{1}{2} \times \frac{1}{2} \times \frac{1}{2} = \frac{1}{8}$$

'countably infinite sample space'

Toss - until head occurs

$$\omega = \{1, 2, 3, \dots\}$$

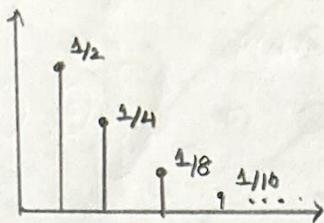
$$P(n) = \frac{1}{2^n}$$

$$P(1) = \frac{1}{2}, P(2) = \frac{1}{2} \cdot \frac{1}{2}, P(3) = \frac{1}{2} \cdot \frac{1}{2} \cdot \frac{1}{2}, \dots$$

↓ tail ↓ Head

$$\frac{1}{2} = \frac{8}{16}$$

$\circ$  No bound - Prüfgegen  $\{1, 2, \dots\}$



$$P(\{2, 4, 6, 8, \dots\}) = \text{even attempt} = P(2) + P(4) + \dots + P(\dots)$$

$$= \frac{1}{2^2} + \frac{1}{2^4} + \dots$$

$$= \frac{1}{2^2} \left( 1 + \frac{1}{2^2} + \frac{1}{2^4} + \frac{1}{2^6} + \dots \right)$$

$$\text{countable additivity axiom} \quad = \frac{1}{4} \sum_{n=0}^{\infty} \left( \frac{1}{4} \right)^n = \frac{1}{4} \left( \frac{1}{1-\frac{1}{4}} \right)$$

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

Countable additivity axiom: If

$$P(A_1 \cup A_2 \cup \dots) = P(A_1) + P(A_2) + \dots$$

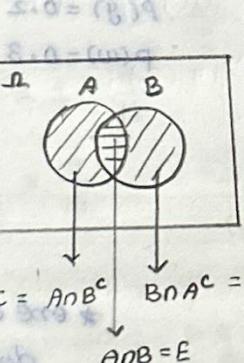
[disjoint]

Sequence - ordered collection

$$+0 = (x)q$$

Recitation

1)



$$P(C \cup D) = P(A) + P(B) - 2P(E)$$

$$P(A) \geq 0$$

$$P(\Omega) = 1$$

$$\text{If } A \cap B = \emptyset$$

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

$$P(C \cup D) = P(A) + P(B) - 0$$

$$P(C \cup D) = P(A) + P(B)$$

$$P(C \cup D) = P(C) + P(D)$$

$$[P(A \cap B) = 0]$$

Also

$$P(C \cup D) = P(A) - P(E)$$

$$+ P(B) - P(E)$$

$$\therefore P(A) = P(C) + P(E)$$

$$P(B) = P(D) + P(E)$$

$$P(C \cup D) = P(C) + P(D)$$

$\therefore C$  and  $D$  are disjoint

$\therefore$  If  $A$  and  $B$  are disjoint

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

(unit in mod) from on

## Geniuses & chocolates

simplif - based on

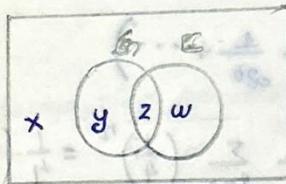
$$* P(A \cup B) = P(A) + P(B) - P(A \cap B) \quad [\text{not disjoint}]$$

$$P(\text{genius}) = 0.6$$

$$P(\text{chocolate}) = 0.7$$

$$P(\text{G} \cap \text{C}) = 0.4$$

Neither a genius - nor a chocolate



$$P(A^c \cap B^c) = 1 - P(A \cup B)$$

(outside the two circles)

$$P(A^c \cap B^c) = 1 - (P(A) + P(B) - P(A \cap B))$$

$$x+y+z+w = 1$$

$$P(x) + P(y) + P(z) + P(w) = 1$$

$$P(x) = 1 - (P(y) + P(z) + P(w))$$

$$= 1 - (0.6 + 0.7 - 0.4)$$

$$= 1 - (0.6 + 0.3)$$

$$= 0.1$$

$$P(G) = P(Y+Z) = P(Y) + P(Z) = 0.6$$

$$P(C) = P(Z+W) = P(Z) + P(W) = 0.7$$

$$P(Z) = 0.4$$

$$P(Y) = 0.2$$

$$P(W) = 0.3$$

$$P(x) = 1 - 0.9$$

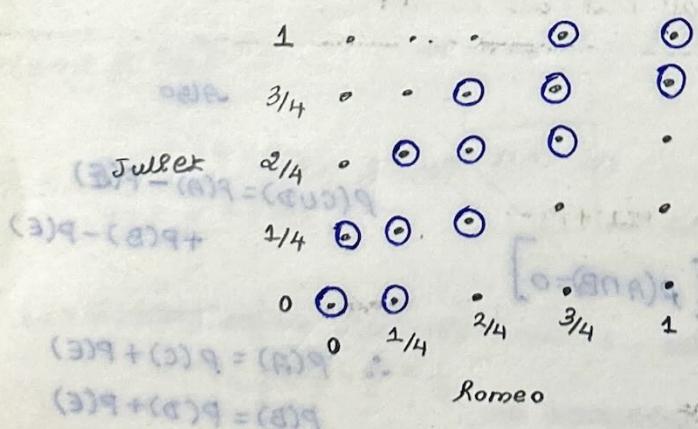
$$\boxed{P(x) = 0.1}$$

0 ≤ (x) ≤ 1

x = (a) 0

negative (0-1 hours delay)

\* one can wait  
from 15 minutes



$$P(\text{event}) = \frac{13}{16} \text{ DNA} \quad \text{at} \\ (S)9 + (A)9 = (SVA)9$$

$$0 - (S)9 + (A)9 = (SA)9$$

$$(S)9 + (A)9 = (SVA)9$$

$$(A)9 + (C)9 = (AC)9$$

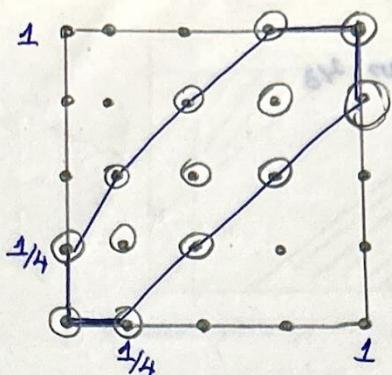
$$(C)9 + (G)9 = (CG)9$$

→ 'All pairs of causally IP Kelly'

→ will wait from 15 minutes (when one came - others came back up to 15 minutes)

Romeo comes  $\frac{1}{4}$ , Juliet  $\frac{2}{4}$

No work (Both at time)



'Sarvam - our new Sample space' - Any point.

Romeo comes at 0 - Juliet at  $\frac{1}{4}$  (~~if Juliet is even 1 sec late they can't meet~~)

'A shape'

$$\text{Area} = 1 - \text{Area of } 2 \Delta^s$$

$$= 1 - 2 \left( \frac{1}{2} \times b \times h \right)$$

$\rightarrow$  'continuous'

$$= 1 - 2 \left( \frac{1}{2} \times \frac{3}{4} \times \frac{3}{4} \right)$$

$$= 1 - \frac{9}{16}$$

$$P(\text{meet}) = \frac{7}{16}$$

In discrete - we neglect in b/w points (except  $0, \frac{1}{4}, \frac{1}{2}, \frac{3}{4}, 1$ )

continuous - we take all possible points

$$1) P(\text{even face}) = \alpha P$$

$$P(\text{odd face}) = \beta$$

$$P(1 \text{ or } 2 \text{ or } 3) = P(1) + P(2) + P(3)$$

$$= \beta + 2\alpha + \beta$$

$$= 4P = 4 \left( \frac{1}{9} \right) = \frac{4}{9}$$

$$P(1) + P(2) + P(3) + P(4) + P(5) + P(6) = 1$$

$$3P + 2(3P) = 1$$

$$P = \frac{1}{10}$$

Alice & Bob each choose at random a number in the interval  $[0, 2]$ . We assume a uniform probability law under which the prob of an event is proportional to its area. Consider

9) If the magnitude of the difference of the two numbers is greater than  $\frac{1}{3}$ .

B: Atleast one of the numbers is greater than  $\frac{1}{3}$

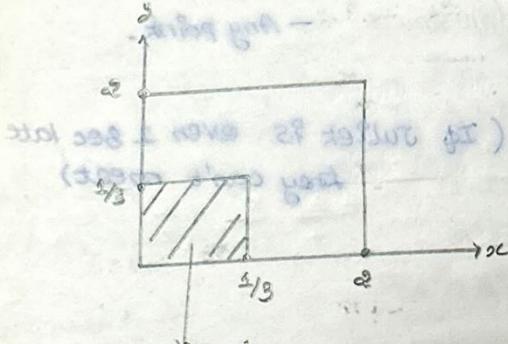
C: The two numbers are equal

D: Alice's number is greater than  $\frac{1}{3}$

$P(B), P(C), P(\text{And})$

Solu:

$$P(B) = 1 - (\text{Both are less than } \frac{1}{3})$$



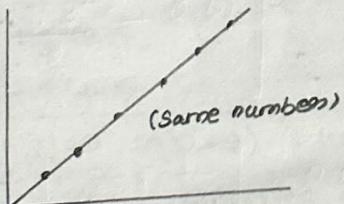
Both are below  $\frac{1}{3}$  b/w this interval.

$$= 1 - \frac{(\frac{1}{3})(\frac{1}{3})}{2 \times 2} \rightarrow \text{our position}$$

$$= 1 - \frac{1/9}{4} \rightarrow 1 - \frac{1}{36} =$$

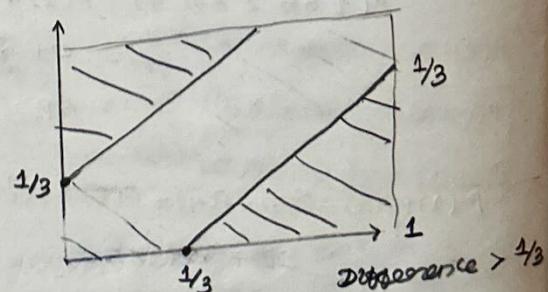
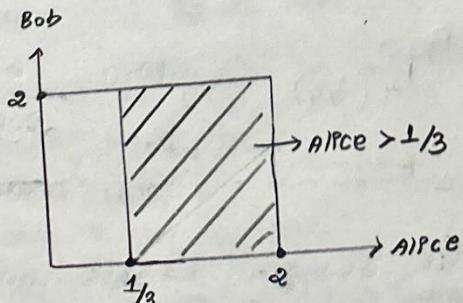
$$= \frac{35}{36} \left( \frac{1}{4} \times \frac{1}{4} \times \frac{1}{2} \right) \rightarrow 1 - \frac{1}{36} =$$

iii)  $P(C) = \text{Two numbers are equal}$



$$\text{Diagonal line} \rightarrow \text{Area} = 0 \quad P(C) = \frac{0}{4} = 0$$

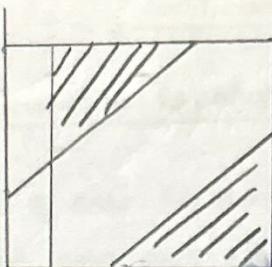
$P(\text{And}) = \text{Alice's number greater than } \frac{1}{3} \text{ and magnitude b/w difference } \frac{1}{3}$



$\downarrow$   
as  $(x, 0)$  we can't take because it makes a condition that  $x > 1/3$   
so go away out Alice  $\frac{1}{3}$ , magnitude about  $\frac{1}{3}$  (Area)

Alice  $\rightarrow 0, Bob > \frac{1}{3}$

$Bob \rightarrow 0, Alice > \frac{1}{3}$



$$\frac{\text{Area} + \text{Area}}{50} = \text{total area}$$

$$\frac{10 \cdot 9 + (10 \cdot 9) \cdot \frac{1}{4}}{50} = 10\pi$$

$$\frac{1}{50} \pi R^2 = \frac{\pi R^2}{50}$$

$$P(A \cap D) = \left( \frac{1}{2} \times \frac{5}{3} \times \frac{5}{3} \right) + \left( \frac{1}{2} \times \frac{4}{3} \times \frac{4}{3} \right) = \frac{41}{72}$$

$$\frac{41}{72} = \frac{\pi R^2}{50} \times \frac{1}{4}$$

$$\frac{1}{50} = \frac{1}{4}$$

$\rightarrow$  able to attack

Mike & John - Daunt - MadPub: 10in

1in off the centre - 50pts

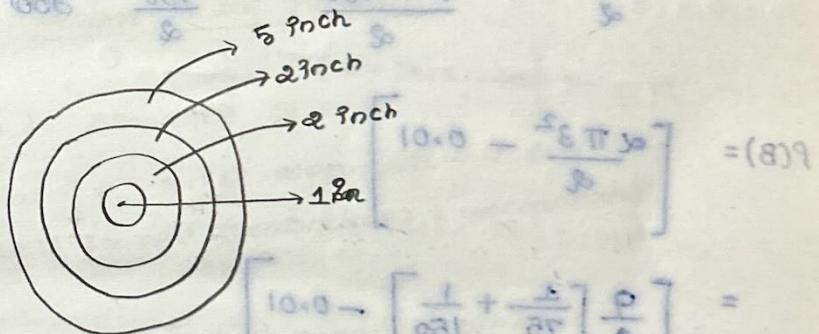
1 to 3  $\rightarrow$  30  $\frac{1}{50} = \frac{1}{4}$   $\rightarrow$  Able to attack daunt.

3 to 5  $\rightarrow$  20  $\frac{1}{50}$

further 5in  $\rightarrow$  10

(The prob of the daunt falling in a grn reign is  $\alpha$  to 9ts area)

a) i) 50 points on 1 throw (Mike)



Total board prob = 1

$$\alpha \pi R^2 = 1$$

$$\alpha \pi R^2 = 1$$

$$\alpha = \frac{1}{\pi \times 100}$$

$$\alpha = \frac{1}{100\pi}$$

ii) Mike throws - 50points

$$\alpha \pi R^2 = P(A) = \frac{10 \cdot 9}{50} =$$

$$P(A) = \frac{1}{100\pi} \pi(1)$$

$$= \frac{1}{100} = 0.01$$

B) 30 points on one throw.

$$\alpha \pi R^2 - \alpha \pi 1^2 = P(B)$$

$$P(B) = \frac{1}{100} (9-1)$$

$$= 0.08$$

c) John - Right handed, twice more likely throw in the right half of the board than left.

Across each half, the daunt falls uniformly in that reign. Answers A) and B) goes John's.

A) For John  $\Rightarrow \frac{\text{Right} + \text{left}}{2}$

$$P(A) \Rightarrow \frac{\alpha(0.01) + 0.01}{2}$$

From Right side:

$$\frac{\alpha R^2 \pi}{2} = \alpha 50\pi \rightarrow \text{one side}$$

Left side:

$$\text{Right side} \rightarrow \text{twice } \left(\frac{\alpha}{3}\right) \times \alpha 50\pi = \frac{2}{3}$$

$$\text{Left side} \rightarrow \frac{1}{3} \quad \alpha = \frac{1}{75\pi}$$

$$\alpha 50\pi = 1$$

$$\alpha 50\pi = \frac{1}{3}$$

$$\alpha = \frac{1}{150\pi}$$

Right + Left:

$$\therefore P(A) = \frac{\alpha \pi R^2}{2} = \frac{\frac{1}{75} + \frac{1}{150}}{2} = \frac{\frac{3}{150}}{2} = \frac{\frac{3}{300}}{2} = \frac{1}{300} = 0.01$$

$$P(B) = \left[ \frac{\alpha \pi R^2}{2} - 0.01 \right]$$

$$= \left[ \frac{9}{2} \left[ \frac{1}{75} + \frac{1}{150} \right] - 0.01 \right]$$

$$= \left[ \frac{9 \times 3}{300} - 0.01 \right]$$

$$(3) \pi \frac{1}{100} = (6) \frac{1}{100}$$

$$= \frac{9}{100} - 0.01$$

$$100 \cdot 9 = \frac{1}{100} =$$

$$= 0.08$$

His habit doesn't affects his probability of winning

Equal potential candidates:  $= \frac{1}{100} - \frac{1}{300} = \frac{1}{100}$

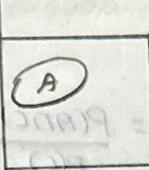
$$(1-P) \frac{1}{100} = (8) \frac{1}{100}$$

$$80.0 =$$

conditioning & Bayes Rule'Information is always partial'

If we take sequence of sets (no sequence), the probability of the outcome assuming the sets are disjoint.

y



(x,y)

$$P(A) = \text{area}(A)$$

$$P(A) = \bigcup_{x,y} \{(x,y)\}$$

$$1 = P[\square] = P\left(\bigcup_{x,y} \{(x,y)\}\right) = \sum_{x,y} P(\{(x,y)\}) \neq \bigcup_{q=1}^{\infty} A_q$$

(Sequence only applicable)

one element set: area = 0

$$\boxed{P(\text{one element set}) = 0}$$

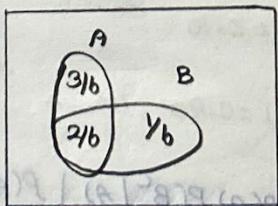
 $\sum 0 \neq 0 \longrightarrow \text{Not a sequence.}$ 
'where is the problem'

Additivity axiom: Applies to sequence of sets.

$\infty$ -sets are bigger  $\rightarrow$  integers can be arranged in a sequence  
 $\rightarrow$  unit square (continuous) - uncountable.

0 → probability is extremely low - don't mean doesn't.

'Based on info we built a model' → New info → update model

conditional probability

'Event: B has occurred'

$$P(A|B) = \frac{2}{3}$$

 $\hookrightarrow$  'B is our new probability'
Assuming  $P(B) \neq 0$ 

$$P(A|B) = \frac{P(ANB)}{P(B)} \rightarrow \text{what fraction of } A \text{ occurred in } B$$

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

 $P(A|B)$  undefined if  $P(B) = 0$

$$P(A \cap B) = P(B) P(A|B)$$

$$= P(A) P(B|A)$$

$\hookrightarrow$  what if one event  $P(A)$  or  $P(B)$  occurs  $\times$  their conditional prob.

$$A \cap B = \emptyset$$

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

'Event c occurred'

$$P(A \cup B | C) = P(A|C) + P(B|C)$$

$$\begin{aligned} &= \frac{P(A \cup B \cap C)}{P(C)} = \frac{P((A+B) \cap C)}{P(C)} = \frac{P(AC) + P(BC)}{P(C)} \\ &= \frac{P(A \cap C)}{P(C)} + \frac{P(BC)}{P(C)} \\ &= P(A|C) + P(B|C) \end{aligned}$$

Die model  $\rightarrow$  uniform distribution

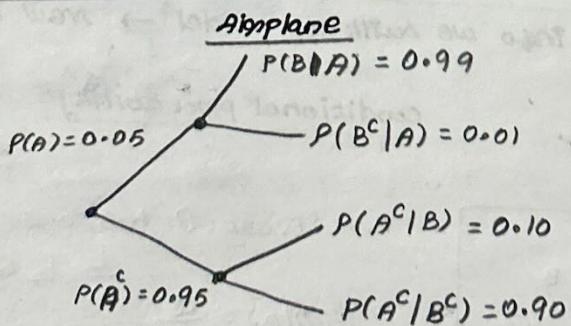
$$\min(x, y) = 2 = (2, 2), (2, 3), (2, 4), (3, 2), (4, 2)$$

$$M = \max(x, y) = 1 = (2, 2), (1, 1), (1, 2)$$

$$P(M=1 | \min(x, y) = 2) = \frac{0}{5/16} = 0$$

$$P(M=2 | \min(x, y) = 2) = \frac{1/16}{5/16} = \frac{1}{5}$$

(still the model is uniform but in the new universe)



$$\begin{aligned} P(AB) &= P(A) \cdot P(B|A) \\ &= (0.05)(0.99) \\ &\approx 0.0495 \end{aligned}$$

$$\begin{aligned} P(ANB^c) &= P(A) P(B^c|A) \\ &= (0.05)(0.01) \\ &= 0.0005 \end{aligned}$$

$$\begin{aligned} P(A^c \cap B^c) &= (0.95)(0.90) \\ &= 0.855 \end{aligned}$$

$P(AB) \rightarrow$  plane there, Radar detects.

$P(\text{good}) = \text{plane \& shadow find} + \text{No plane shadow don't}$

$$= 0.0495 + 0.855$$

$$= 0.9045$$

$P(\text{Bad}) = \text{No plane \& detects} + \text{plane \& no detects}$

$$= 0.095 + 0.0005$$

$$= 0.0955$$

$$\left. \begin{array}{l} P(B) = (0.05)(0.99) + (0.95)(0.10) \\ = 0.0495 + 0.095 \\ = 0.1445 \end{array} \right| \quad \left. \begin{array}{l} P(\bar{B}) = 0.0005 + 0.855 \\ = 0.8555 \end{array} \right|$$

$P(A|B) = \text{Some thing fly, shadow shows}$

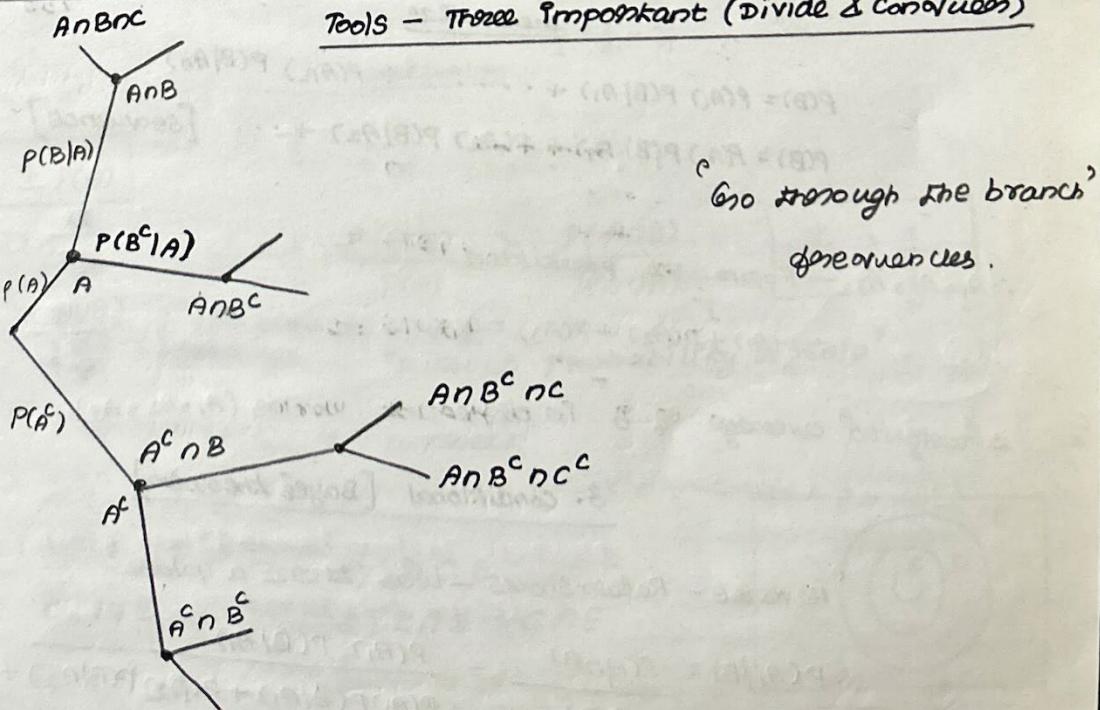
$$= \frac{P(AB)}{P(B)} = \frac{0.0495}{0.1445} = 0.3425 \rightarrow \text{only } 30\% \rightarrow \text{we can't rely on that}$$

$$P(A|B^c) = \frac{P(AB^c)}{P(B^c)} = \frac{0.0005}{0.8555} = 0.000584$$

$$P(A^c|B) = \frac{0.095}{0.1445} = 0.6574 \rightarrow \text{False alarm. [more likely]}$$

"mostly False alarm"

Tools - Three Important (Divide & Conquer)

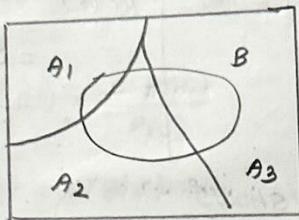


"how often A occurs → out of the times A occurs how many times B occurs → " " A \& B " " how.m. C occurring?"

$$P(A \cap B \cap C) = P(A \cap B) \cdot P(C | A \cap B) \\ = P(A) \cdot P(B | A) \cdot P(C | A \cap B)$$

### 2. Total probability

- \*  $B \rightarrow$  Result of certain probabilities
- \* Divide & conquer.
- \* Partition of sample space  $A_1, A_2, A_3$
- \* Have  $P(B | A_i)$  for every  $i$



$$P(B) = P(A_1) P(B | A_1) + P(A_2) P(B | A_2) + P(A_3) P(B | A_3)$$

$$\begin{aligned} A_1 &\longrightarrow A_1 \cap B \\ A_2 &\longrightarrow A_2 \cap B \\ A_3 &\longrightarrow A_3 \cap B \end{aligned}$$

$$P(B) = P(A_1 \cap B) + P(A_2 \cap B) + P(A_3 \cap B)$$

$$\therefore P(B) = P(A_1) \cdot P(B | A_1) + P(A_2) \cdot P(B | A_2) + P(A_3) \cdot P(B | A_3)$$

Generalize

$$P(B) = P(A_1) P(B | A_1) + \dots + P(A_n) P(B | A_n)$$

$$P(B) = P(A_1) P(B | A_1) + P(A_2) P(B | A_2) + \dots \quad [\text{Sequence}]$$

$\therefore A_1, A_2, A_3 \rightarrow$  Form the partition

$$\therefore P(A_1) + P(A_2) + P(A_3) = 1$$

$\therefore$  weighted average of  $B$  in different worlds ( $A_1, A_2, A_3$ )

### 3. Conditional [Bayes theorem]

"Reverse - Radar shows - was there a plane"

$$P(A_1 | B) = \frac{P(A_1 \cap B)}{P(B)} = \frac{P(A_1) P(B | A_1)}{P(A_1) P(B | A_1) + P(A_2) P(B | A_2) + P(A_3) P(B | A_3)}$$

When we see  $A$  emit  $\Rightarrow$  don't change a world  
When we see  $C$  emit  $\Rightarrow$  change a world

$\therefore$  Get Radom records  $\rightarrow$  change our belief  $\rightarrow$  update.

'Reverses the order of conditioning'

'Model of cause & effect'

$$\begin{array}{l} \text{model} \\ A \rightarrow B \\ P(B|A) \end{array} \quad (\text{Indeed}) \quad \begin{array}{c} \xleftarrow{\text{preference}} \\ A \leftarrow B \\ P(A|B) \end{array}$$

'Learn from experience'

'Interpolate new knowledge from previous knowledge'

### Recitation

A: 1st toss head  
B: 2nd toss head

$$A \cap B = ?$$

$$i) P(A \cap B | A) \quad ii) P(A \cap B | A \cup B)$$

$\hookrightarrow$  'at least one is head'

Solu?

$$P(A \cap B | A) = \frac{P((A \cap B) \cap A)}{P(A)} = \frac{P(A \cap B) \cap A}{P(A)} \quad \left( \frac{1}{2} \right)$$

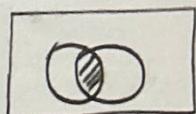
(Intersection)

$$= \frac{P(A \cap B)}{P(A)} = \frac{\frac{1}{2} \cdot \frac{1}{2}}{\frac{1}{2}} = \frac{1}{2}$$

Solutions  $\rightarrow$  Slides

$\therefore$  Independent

$$P(A \cap B) = P(A) \cdot P(B)$$



$$P(A \cap B | A \cup B) = \frac{P((A \cap B) \cap (A \cup B))}{P(A \cup B)} = \frac{P(A \cap B)}{P(A \cup B)} = \frac{\frac{1}{2} \cdot \frac{1}{2}}{\frac{1}{2} + \frac{1}{2} - \frac{1}{4}} = \frac{\frac{1}{4}}{\frac{1}{2}} = \frac{1}{4} = \frac{1}{3}$$

Conclusion

$$P(A \cup B) \geq P(A)$$

$$\frac{1}{2} = \frac{2}{3} = (A \cup B | A)$$

$$A \cup B \supseteq A \therefore \frac{P(A \cap B)}{P(A)} \geq \frac{P(A \cap B)}{P(A \cup B)}$$

$$P(A) \subset P(A \cup B)$$

$$\frac{1}{2} > \frac{1}{3}$$

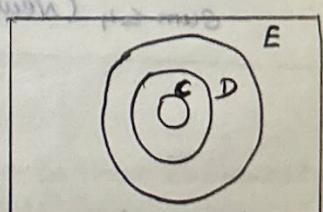
'Alice is correct'

(single standard min)

Generalize: ~~less world  $\leftarrow$  most common states~~

$$1) D \subseteq E$$

$$2) C \cap D = C \cap E$$



$$P(C|D) \geq P(C|E)$$

$\therefore$  Knowing D occurs, Prob of C is more than knowing E occurs.

$$C = A \cap B$$

$$D = A$$

$$E = A \cup B$$

$$C \cap D$$

$$C \cap D = C \cap E$$

$$P(C|D) \geq P(C|E)$$

$$P(A \cap B | A) \geq P(A \cap B | A \cup B)$$

### Conditioning example

Die 2

↓

6

5

4

3

2

1

↓

1 2 3 4 5 6 ← Die 1

$$1 = 8nA$$

$$(A \cap B | A \cap B) \neq 1 \quad (A | A \cap B) \neq$$

discrete uniform law:

$$\mathcal{P}(A) = \frac{|A|}{1-n}$$

### Conditional example

$$P(D) = \frac{|D|}{36} = \frac{(8nA)}{36} = \frac{8}{36}$$

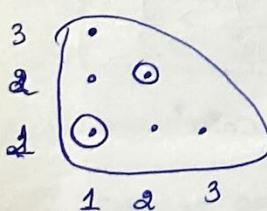
'double - matches'

$$a) P(D) = \frac{6}{36} = \frac{1}{6}$$

$$b) P(\text{Sum} \leq 4) = \frac{P(\text{Sum} \leq 4)}{P(\text{Sum} \leq 4)} = \frac{2}{36} = \frac{1}{18}$$

(new)

$$P(D | \text{Sum} \leq 4) = \frac{2}{6} = \frac{1}{3}$$



sum  $\leq 4$  (New Sample space)

$$c) P(S = \text{one die } \neq 6) = \frac{11}{36}$$

$$d) P(S | K = \text{two different numbers}) = \frac{10}{30} = \frac{1}{3}$$

discrete uniform law  $\rightarrow$  Likely prob.

Sample over problem

'Monty-Hall problem'

'what we are working is really important'

3 doors - Behind one of the doors (one of the doors - there is a prize)

\* choose a door (don't show you)

\* Friend: (knows prize) → look at remaining doors

\* open one of the remaining ones (prize is not there).

\* now: stay or swap

'which is the best strategy'

| choose | prize | open | stay | switch |
|--------|-------|------|------|--------|
| 1      | 1     | 2/3  | ✓    |        |
| 1      | 2     | 3    | x    | ✓      |
| 1      | 3     | 2    | x    | ✓      |
| 1      | 1     | 3    | x    | ✓      |
| 2      | 2     | 1/2  | ✓    |        |
| 2      | 3     | 1    | x    | ✓      |
| 2      | 1     | 2    | x    | ✓      |
| 3      | 1     | 2    | x    | ✓      |
| 3      | 2     | 1    | x    | ✓      |
| 3      | 3     | 4/8  | ✓    |        |

'winning perspective'

choose a door, stay in pt.  
(switch to initial)

Switching:

prize → 2nd door

Friend → can't open my door, 2nd door

(3 2nd doors)

'wrong'

$\frac{1}{3}$  prob of winning.

prize → 3rd door

2nd door - open

$\frac{2}{3}$  - Better to switch

'wrong'

From this point.

lets have a try!

stay

2) swap

1) when initial  
choice is correct

Initial choice is not correct

$\frac{2}{3}$ .

$\frac{1}{3}$

choose Prize open stay switch

'friend can't open the door having prize'

choosing 2 (at cost of 1):

\* picking group of doors.

1 on (2 and 3)

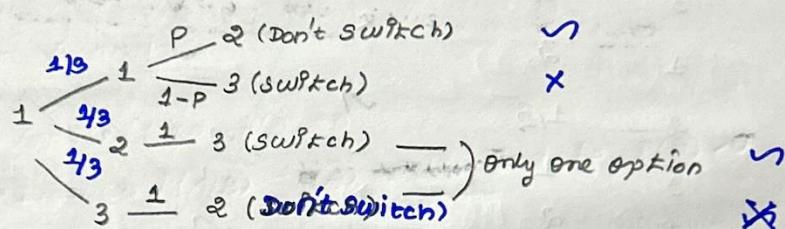
switching: 2 doors at the cost of 1. (Two opportunities)

Important assumption: Friend can't reveal the prize.

\* choose 1 \* If friend open 2 - Don't switch

\* If friend open 3 - Switch.

[Some idea]



You chose 1, prize in 2 → open 3

You chose 1, prize in 3 → open 2

When you will win?

$$\text{switch} = \left(\frac{1}{3}\right)p + \frac{1}{3}(1) = \frac{1}{3}(p+1) = \text{Stay.}$$

$$\begin{aligned} \text{Not switch} &= \left(\frac{1}{3}\right)(1-p) + \left(\frac{1}{3}\right)(1) \\ &= \left(\frac{1}{3}\right)(1-p+1) \\ &= \left(\frac{1}{3}\right)(2-p) \end{aligned}$$

$$\therefore 0 \leq p \leq 1$$

Assume: choose 2 on 3 with

$$p = \frac{1}{2}$$

$$P(\text{win} | C_1) = \frac{1}{2}$$

when  $p = 0$

$\frac{2}{3}$  = Not switch,  $\frac{1}{3}$  (Stay) → can't be good as switching.

when  $p = 1$

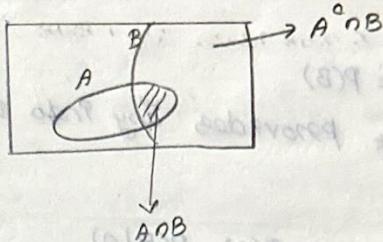
$\frac{1}{3}$  = not switch,  $\frac{2}{3}$  (Stay)

'with strategies - the probability changes'

$$1) P(A \cap B \cap C) = P(A) \cdot P(B|A) \cdot P(C|A \cap B)$$

$$2) P(B) = P(A_1) P(B|A_1) + \dots$$

$$3) P(A_1|B) = \frac{P(A_1) P(B|A_1)}{P(A_1) P(B|A_1) + \dots}$$



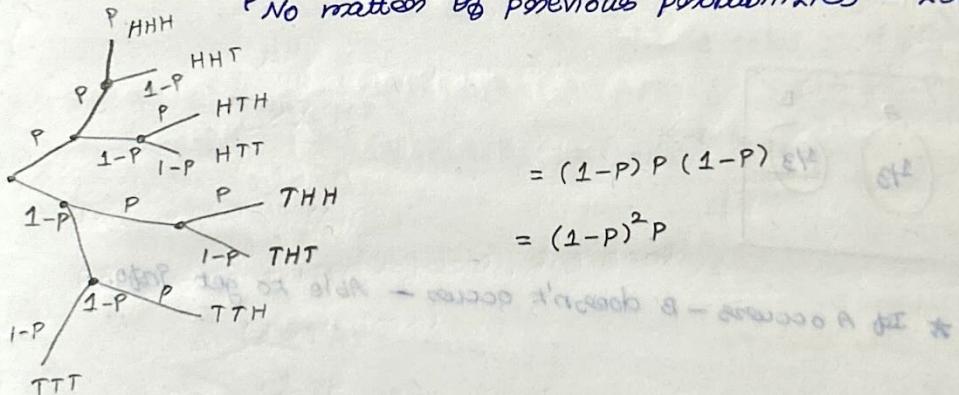
$$P(B) = P(A) P(B|A) + P(A^c) P(B|A^c)$$

Inference - measure - which branch occurred → Bayes rule.

3 tosses of a biased coin:

$$P(\text{HTH}) = P(T_1) \cdot P(H_2|T_1) \cdot P(T_3|H_2 \cap T_1)$$

'No matter of previous probabilities' - losses.



$$= (1-P) P (1-P)$$

$$= (1-P)^2 P$$

$$P(\text{1 head}) = TTH + HTT + THT$$

$$= 3(1-P)^2 P$$

$$P(\text{first head} | 1 \text{ head}) =$$

$$\frac{P(\text{first head}) P(\text{1 head} | \text{1 head})}{P(H_1) P(\text{1H} | H_1) + \dots}$$

$$= \frac{P(\text{first head} \cap \text{1 head})}{P(\text{1 head})} \quad [\text{Normal}]$$

$$= \frac{(1-P)^2 P^3}{3(1-P)^2 P} = \frac{1}{3}$$

3 losses

Head in

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

(one of  
3 is  
head)

only one  
head.

From the image,

$T_1 \rightarrow$  prob of second head = P ] Not making dependence.  
 $H_1 \rightarrow$  prob of second head = P

### Independence

\* 'Doesn't changing intuition'

$$P(B|A) = P(B)$$

'Occurrence of A doesn't provides any info on B's occurrence'

$$\therefore P(A \cap B) = P(A) \cdot P(B|A)$$

$$P(A \cap B) = P(A) \cdot P(B) \rightarrow \text{Not Impaired.}$$

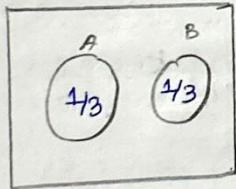
Symmetric w.r.t A and B:

\* Applies even  $P(A) = 0$

\* Implies  $P(A|B) = P(A) \rightarrow$  Impaired to  $P(B) > 0$

\* distinct physical phenomena?

↳ physically related - But may be independent?



\* If A occurs - B doesn't occur - Able to get info.

$$P(A \cap B) = P(A) \cdot P(B)$$

$$0 = \frac{1}{3} \cdot \frac{1}{3}$$

$$0 \neq \frac{1}{9} \rightarrow \text{No independence.}$$

$$P(A|B) = 0 \neq P(A) \quad \therefore A \text{ conveys information.}$$

\* even - never enough to say whether independent or not?

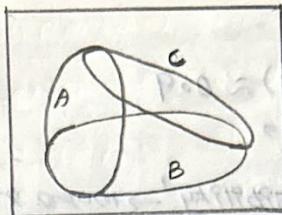
\* conditional prob are also like normal probabilities

### Conditional Independence

$$P(A \cap B | C) = P(A|C) \cdot P(B|C)$$



'conditional independence'



$A$  and  $B$  are independent

\* If we are told that occurred, are  $A$  &  $B$  independent?

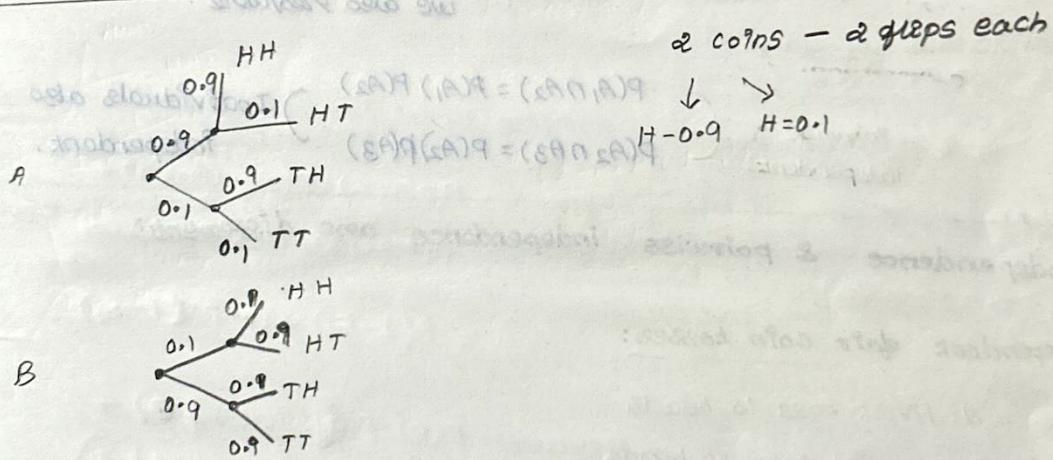
$$P(A \cap B | C) = \frac{P(A \cap B \cap C)}{P(C)} = \text{Is still } A \text{ and } B \text{ independent?}$$

C - occurred [we know A - occurred  $\rightarrow$  B doesn't]  $\rightarrow$  Not independent

In the new world -  $A$  &  $B$  are disjoint.

Having independence in original model doesn't implies that they are independent in the conditional world.

Two unfair coins:  $(0.9 - \text{Heads}, 0.1 - \text{Tails})$



Are the coins independent?

\* 2nd & 1st toss are independent

\* one we know  $A$  is the coin!  $\rightarrow$  so two tosses are independent

2) If we don't know which coin is, are tosses independent.

Compare  $P(\text{toss 1} = \text{Head})$

$P(\text{toss 1} | \text{first 10 tosses are heads})$

Solution: we can choose  $A \xrightarrow{H=0.9} \text{on } B \xrightarrow{H=0.1}$

$$P(\text{toss 1} = \text{Head}) = P(A) \cdot P(\text{head}) + P(B) \cdot P(\text{head}) = \frac{1}{2}(0.9) + \frac{1}{2}(0.1)$$

$$= \frac{1}{2}$$

$$P(\text{Loss} || 10 \text{ previous heads}) = P(\text{Loss} || B) \approx 0.9$$

↳ extremely low in  $B^c$

'A has more probability  $\rightarrow$  more reasonable (likely)

'It is not independent anymore'

'unconditional & conditional independence are different'

### 'multiple independence'

The previous coin losses doesn't change yours belief on the present toss

$$P(A_1 \cap (A_2^c \cup A_3) | A_5 \cap A_6^c) = P(A_1 \cap (A_2^c \cup A_3))$$

↳ 5 th flip - knowing - Not going to impact

$$P(A_1 \cap A_2 \dots \cap A_n) = P(A_1) P(A_2) \dots P(A_n)$$

For any distinct events

we also get

$$\begin{aligned} P(A_1 \cap A_2) &= P(A_1) P(A_2) \\ P(A_2 \cap A_3) &= P(A_2) P(A_3) \end{aligned} \quad \begin{array}{l} \text{pairwise} \\ \text{independent.} \end{array} \quad \begin{array}{l} \text{Individuals also} \\ \text{independent.} \end{array}$$

'Independence & pairwise independence are different'

Two independent coin tosses:

A: first toss is heads

B: second toss is heads

$$P(A) = P(B) = \frac{1}{2}$$

$$P(A \cap B) = \frac{1}{4} = P(A) P(B) = \frac{1}{4}$$

C: First & second toss in same result.

$$P(C) = \frac{\alpha}{4} = \frac{1}{2}$$

$$P(C \cap A) = \frac{1}{4} = P(A) P(C) = \frac{1}{4}$$

$$P(A \cap B \cap C) = \frac{1}{4} \neq P(A) P(B) P(C) = \frac{1}{8}$$

$$(1-\frac{1}{2})^2 + (1-\frac{1}{2}) \cdot \frac{1}{2} = (\text{head})q \cdot (\text{tail})q + (\text{tail})q \cdot (\text{head})q = (\text{tail})q = \frac{1}{2}$$

$$P(C|A \cap B) = 1 \text{ [certain]}$$

- \*  $A \cap B \rightarrow$  we have one element universe (certain)
- \* So  $C (A \cap B) \rightarrow$  gives  $C$  is certain  $\rightarrow$  not independent.

$$P(C|A \cap B) \neq P(C)$$

$(A \cap B \text{ and } C)$  are pairwise independent.

King comes from a family of two children (Boy). What's the prob that his sibling is female?

Sol:

$$P(\text{Female} | \text{King}) = \frac{P(\text{Female} \cap \text{King})}{P(\text{King})} \quad \therefore P(\text{Female}) \text{ & } P(\text{King}) \text{ are independent.}$$

$$P(\text{King}) = \frac{1}{2} \quad = \frac{\frac{1}{2} \cdot \frac{1}{2}}{\frac{1}{2}} = \frac{2}{4} = \frac{1}{2}$$

$$P(\text{Female}) = \frac{1}{2}$$

only two families has both King & sibling,

Assumption

|    |    |
|----|----|
| BB | BG |
| GB | GG |

New universe

1 boy, 1 girl

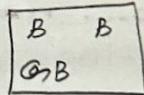
\* Exactly two children

Caution:

\* King has precedence

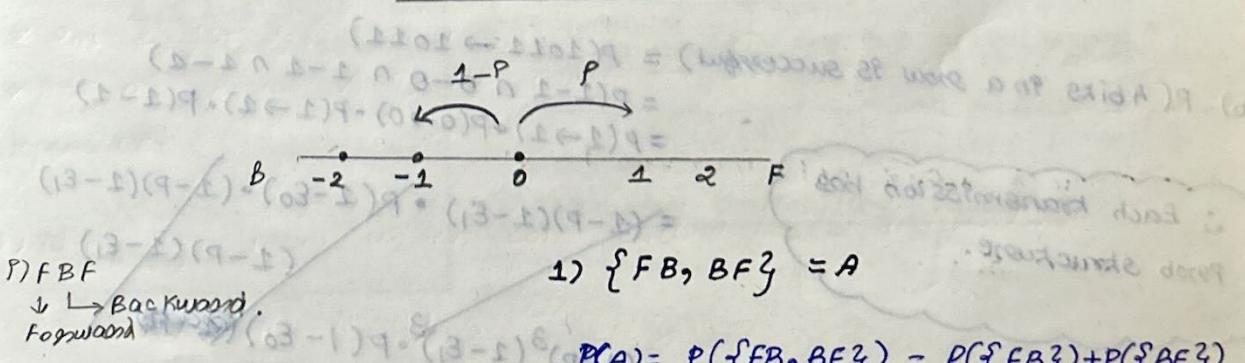
\* At least one King

\* Continue until a King  $\rightarrow$



$P(\text{Sibling}) = 1 \rightarrow$  depends on assumption  
 $P(\text{Sibling})$  changes.

### Recitation - A random walk



$\therefore$  Forward & Backward are independent

$$= P \cdot (1-P) + (1-P)P$$

$$= 2P(1-P)$$

$$(3-1) \cdot (3-1) =$$

At position 1 after 3 steps:

$$P(B) = \{FFB, FBF, BFF\}$$

$$P(B) = 3P^2(1-P)$$

Probability: First step is downward

$$D = \{FFB, FBF\}$$

$$P(D) = 2P^2(1-P)$$

$$= 2P^2(1-P)$$

$$P(D|C) = \frac{P(D \cap C)}{P(C)} = \frac{2P^2(1-P)}{3P^2(1-P)} = \frac{2}{3}$$

∴

## 2. Communication over a noisy channel

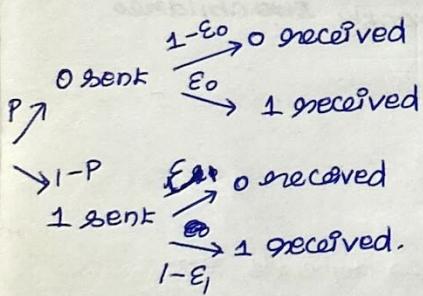
- ① Multiplication rule
- ② Total probability
- ③ Independence
- ④ Bayes rule.

communication channel (Binary)

$$0 \rightarrow 0$$

$$1 \rightarrow 1$$

$$\begin{array}{l} 0 \rightarrow 1 \\ 1 \rightarrow 0 \end{array} \quad [\text{some noise is there}]$$



a)  $P(\text{successful transmission}) =$

$$\begin{aligned} & P(0 \text{ sent}) \cdot P(0 \text{ received}) + \\ & P(1 \text{ sent}) \cdot P(1 \text{ received}) \\ & = P(1 - \varepsilon_0) + (1 - P)(1 - \varepsilon_1) \end{aligned}$$

$$\begin{aligned} P(\text{success}) &= P(0) \cdot P(\text{success } 0) + \\ & P(1) \cdot P(\text{success } 1) \end{aligned}$$

$$\begin{aligned} b) P(\text{4 bits in a row is successful}) &= P(1011 \rightarrow 1011) \\ &= P(1 \rightarrow 1 \wedge 0 \rightarrow 0 \wedge 1 \rightarrow 1 \wedge 1 \rightarrow 1) \\ &= P(1 \rightarrow 1) \cdot P(0 \rightarrow 0) \cdot P(1 \rightarrow 1) \cdot P(1 \rightarrow 1) \end{aligned}$$

$$\begin{aligned} &= (1 - P)(1 - \varepsilon_1) \cdot (1 - \varepsilon_0) \cdot (1 - P)(1 - \varepsilon_1) \\ &= (1 - P)^3 (1 - \varepsilon_1)^3 \cdot P(1 - \varepsilon_0) \end{aligned}$$

$$= \text{chosen } 1 \rightarrow \text{no prob in choosing}$$

$$= (1 - \varepsilon_1)^3 (1 - \varepsilon_0)$$

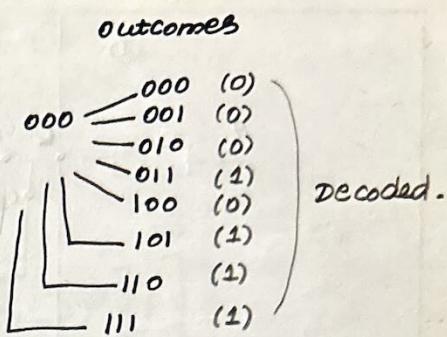
∴ Each transmission has prob structure.

c) each symbol transmitted thrice

$0 \rightarrow$  At least 2 0's

$1 \rightarrow$  At least 2 1's

$P(0 \text{ correctly decoded}) = ?$



$$P(\text{getting a } 0 \text{ decoded by passing zero}) = P(000) + P(001)$$

$$+ P(100) + P(010)$$

$$= (1 - \varepsilon_0)^3 + 3P(1 - \varepsilon_0)^2$$

$$d) P(0 | 101) = \text{dependence} = \frac{P(0) P(101 | e_0^2)}{P(101)}$$

↓  
Being sent

$$= \frac{P(P(101 | e_0^2))}{P(101)}$$

$$P(101) = P(0) P(101 | 0) + P(1) P(101 | 1)$$

$$= P \cdot P(101 | 0) + (1-P) P(101 | 1)$$

$$P(0 | 101) = \frac{P \cdot P(101 | 0)}{P(0) P(101 | 0) + P(1) P(101 | 1)}$$

$$= \frac{P \cdot (1 - \varepsilon_0) \varepsilon_0^2}{P(1 - \varepsilon_0) \varepsilon_0^2 + (1-P)(1 - \varepsilon_1)^2 \varepsilon_1}$$

$0 \rightarrow 101$

$(000) \rightarrow 101$

↙ /  
two unsuccessful

& 1 successful  
transmission

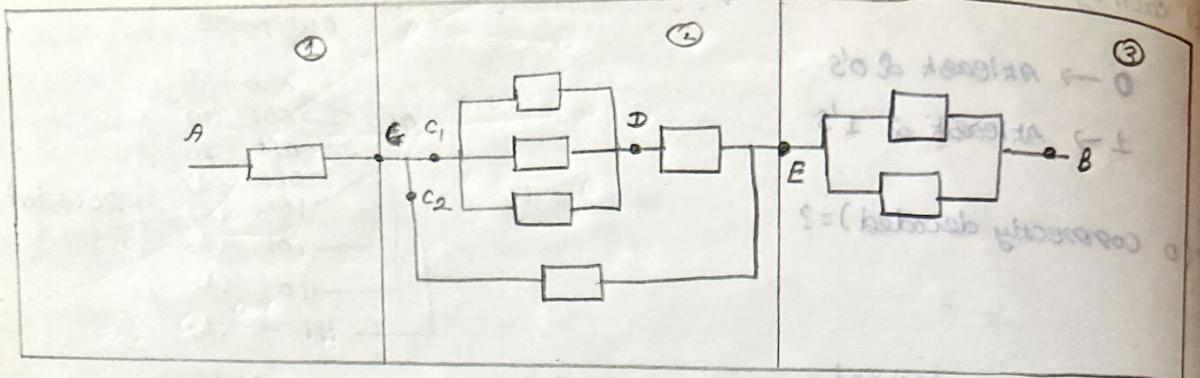
'entry not 1'  $\rightarrow$  ∵ No fair one'

$1 \rightarrow 101$

↙ /  
2 success  
1 failure

'cost - overweighed by corrections'

Network reliability - Tutorial



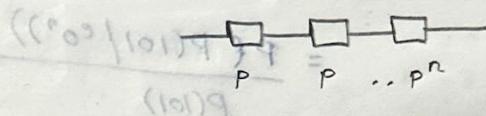
Divide & Conquer

\* operational if a path is there (from A and B)

$P(A \rightarrow B)$ : operational

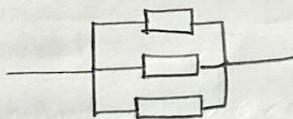
If working at a stage is  $P$

$$\therefore P(A \rightarrow B) = P \times P \times \dots P^n = P^n \quad [\text{series}]$$



Parallel:

At least one = 1 - No one works



$$P(A \rightarrow B) = 1 - (1-P)^n$$

2 collections:

Assume: Each component in both collection: independent.

$$P(A \rightarrow B) = P(A \rightarrow C) \cdot P(E \rightarrow D) \cdot P(E \rightarrow B)$$

$$= P \cdot P(C \rightarrow E) \cdot (1 - (1-P)^2)$$

At least one is working

$$P(C \rightarrow E) = \overbrace{(P(C_1 \rightarrow E) + P(C_2 \rightarrow E))}$$

$$= 1 - (P(C_1 \rightarrow E) \text{ fail} \cdot P(C_2 \rightarrow E) \text{ fail})$$

$$= 1 - (1 - P(C_1 \rightarrow E))(1 - P(C_2 \rightarrow E))$$

↓              ↓  
conjugate of success

$$P(C_1 \rightarrow E) = P \cdot (1 - \text{All parallel fail})$$

$$= P \cdot (1 - (1-P)^3)$$

$$P(C_2 \rightarrow E) = P$$

$$P(C \rightarrow E) = 1 - (1 - P(1 - (1-P)^3))(1-P)$$

$$= 1 - (1 - P + P(1-P)^3)(1-P)$$

\*

$$P(A \rightarrow B) = P \cdot P(C \rightarrow E) (1 - (1-P)^2)$$

$$= P[1 - (1-P)^2] \left[ 1 - (1-P)[1 - (1-P)^3]P \right]$$

① one element series  $\rightarrow$  must work

② parallel  $\rightarrow c_1 \rightarrow$  parallel + series  $\rightarrow$  At least one of 3 blocks work.

$$(c_1 \text{ or } c_2 \text{ work}) = 1 - (\text{All fail}) \quad (1 - \text{All fail})$$

### A chess problem

'Belmont chess champion' - Procedure:

\* Bo & ci (leading)  $\rightarrow$  play a two game match

\* Both game winning person  $\rightarrow$  plays 2 games with AI (current champion)

\* AI-champ  $\rightarrow$  until  $\rightarrow$  second round & challenger beats in both games

\* AI-wins initial game  $\rightarrow$  no need of other game.

$$i) P(B_0 \text{ beat } C_1) = 0.6 \quad [\text{Any particular game}]$$

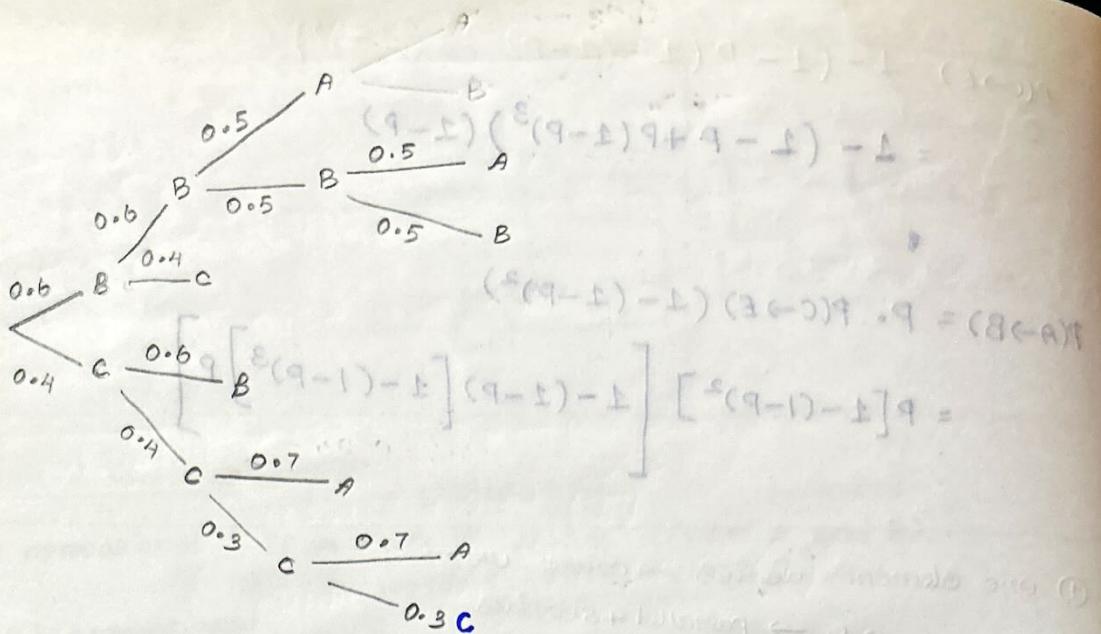
$$ii) P(AI \text{ beat } B_0) = 0.5$$

$$iii) P(AI \text{ beat } C_1) = 0.7$$

Assume: no ties & all games are independent.

a) Det

i) Second round will be measured:



Second round: Play with AI (when any players win both games)

$$P(R_2) = (0.6)(0.6) + (0.4)(0.4) \\ = 0.6^2 + 0.4^2 \quad [\text{Bow won two games or C won two games}]$$

'Second ground': w/ths AI

$$P(R_2) = 0.36 + 0.16$$

$$\boxed{P(R_2) = 0.52}$$

$$\text{ii)} P(\text{Bow wins 1 round}) = 0.6 \times 0.6 = 0.36$$

$$\text{iii)} P(\text{AI wins champion ship}) = P(\text{Any one win by } \downarrow \text{only one win} \quad \text{AI wins} \quad \text{AI wins at } 1 \& 2 \text{ game resp.}) \\ = (0.6)(0.4) + (0.4)(0.6) + [(0.6)(0.6)(0.5) + (0.6)(0.6)(0.5)(0.5)] \\ + [(0.4)(0.4)(0.7) + (0.4)(0.4)(0.3)(0.7)]$$

$$= (0.24 + 0.24) + [0.12 + 0.09] + (0.112 + 0.0336) \\ = 0.8956$$

097

$$P(A) = 1 - P(A)^c \quad [\text{lose deducted from 1}]$$

$$= 1 - [(0.6)(0.6)(0.5)(0.5) + (0.4)(0.4)(0.3)(0.3)]$$

$$= 0.8956.$$

b) 6th, second round is measured  $\rightarrow$

i) Bo is the surviving challenger

ii) AI retains his championship

soln:

$$P(\text{Bo is the surviving challenger} \mid \text{second round}) = \frac{P(B \cap R_2)}{P(R_2)}$$

$$P(B \cap R_2) = P(\text{B wins both}) = 0.6 \times 0.6 = 0.36$$

$\downarrow$   
two ways  $\rightarrow$  Bo wins both  
 $\rightarrow$  CP wins both

$$= \frac{0.36}{0.52}$$
$$= 0.6923$$

ii)  $P(\text{AI retains} \mid \text{second round}) = \frac{P(\text{AI in second round})}{P(\text{second round})}$

AI wins in 6 ways

$\downarrow$   
After round 2

4 ways  $\rightarrow$  win at game 1  
 $\rightarrow$  win at game 2.

$$= \frac{1 - \text{lose(AI)}}{P(\text{second round})}$$

$$= \frac{1 - [(0.6)^2(0.5)^2 + (0.4)^2(0.3)^2]}{0.52}$$

$$= \underline{0.4481}$$

'Since AI is able  
to win in first  
round too'

$$P(\text{AI} \mid \text{second round}) = (0.6)^2(0.5)^2 +$$

$$(0.6)^2(0.5) +$$

$$(0.4)^2(0.7) +$$

$$(0.4)^2(0.3)(0.7)$$

$$= \frac{0.4481}{0.52} = 0.8492$$

' $\downarrow$   
Not possible'

c) Second round was measured & that it has only one game.  
what's the cond. prob that it was Bo who won the first  
round.

$I = \{ \text{Second round with only 1 game} \}$

$B = \{ B_0 \text{ won 1st round} \}$

$$P(B|I) = \text{reverse order} = \text{Bayes theorem}$$
$$= \frac{P(B) \cdot P(I|B)}{P(I)}$$

$\therefore$  Second round played: gn 1 round only.

$$\therefore I = (R_2 \cap 1 \text{ round})$$

$$P(B|R_2 \cap 1 \text{ round}) = P(B|I) = \frac{P(B \cap I)}{P(I)} = \frac{P(B \cap R_2 \cap 1 \text{ round})}{P(R_2 \cap 1 \text{ round})}$$

$\therefore$  Gn: Second round with only one game  $[R_2 \cap 1 \text{ game}]$

$P(B \cap I) = \text{Bow wins 1 round gn and round with only 1 game.}$

$$= \frac{(0.6)(0.6)(0.5)}{(0.6)(0.6)(0.5) + (0.4)(0.4)(0.3)}$$

$$= \frac{(0.6)^2(0.5)}{(0.6)^2(0.5) + (0.4)^2(0.7)}$$

$\underbrace{\downarrow}_{B_0} \quad \underbrace{\downarrow}_{CP \text{ wins both games}}$

Second round with 1 round

$$= \frac{0.18}{0.2920} = 0.6164$$

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Building logic: the key?