



Conditional Probability & Independence



Conditional Probability: Dice

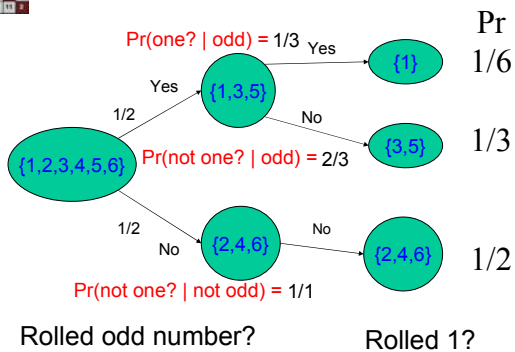
“Knowledge” changes probabilities:

$$\Pr\{\text{die rolled } 1\} = 1/|\{1,2,3,4,5,6\}| = 1/6.$$

$$\begin{aligned} \Pr\{\text{die rolled } 1 \text{ knowing} \\ \text{that die rolled odd number}\} \\ &= 1/|\{1,3,5\}| \\ &= 1/3. \end{aligned}$$



Conditional Probability: Dice



Conditional Probability

$$\Pr\{A \mid B\} ::=$$

probability of event A given that event B has occurred. Formally,

$$\Pr\{A \mid B\} ::= \frac{\Pr\{A \cap B\}}{\Pr\{B\}}$$



Product Rule

$$\begin{aligned} \Pr\{A \cap B\} \\ &= \Pr\{A \mid B\} \Pr\{B\} \end{aligned}$$



Conditional Probability: Monty Hall

$$\Pr\{\text{prize at Door 1} \mid \text{Carol opens 2}\} = 1/2.$$

Really! Outcomes:

(Prize Door, Contestant Door, Carol Door)

$$[\text{Carol opens 2}] = \{(1,1,2), (1,3,2),$$

$$\Pr = \frac{1}{18} \quad \Pr = \frac{1}{9}$$

$$(3,3,2), (3,1,2)\}$$

1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31	32	33	34	35
36	37	38	39	40	41	42

Conditional Probability: Monty Hall

This suggests the contestant may as well **stick**, since the probability is $1/2$ given what he knows at the moment of choosing.

Not so: Contestant knows *more* than door opened by Carol -- also knows: **which door he chose** himself!

1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31	32	33	34	35
36	37	38	39	40	41	42

Conditional Probability: Monty Hall

$$\Pr\{\text{prize at Door 1} \mid \text{Contestant chose 1} \& \text{Carol opens 2}\} = 1/3.$$

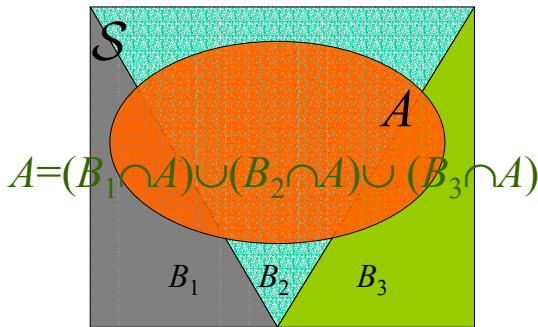
[Contestant chose 1 & Carol opens 2]

$$= \left\{ \underbrace{(1,1,2)}, \underbrace{(3,1,2)} \right\}$$

$$\Pr = \frac{1}{18} \qquad \Pr = \frac{1}{9}$$

1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31	32	33	34	35
36	37	38	39	40	41	42

Law of Total Probability



1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31	32	33	34	35
36	37	38	39	40	41	42

Law of Total Probability

$$A = (B_1 \cap A) \cup (B_2 \cap A) \cup (B_3 \cap A)$$

$$\Pr\{A\} = \Pr\{B_1 \cap A\} + \Pr\{B_2 \cap A\} + \Pr\{B_3 \cap A\}$$

$$= \Pr\{A|B_1\} \cdot \Pr\{B_1\} + \Pr\{A|B_2\} \cdot \Pr\{B_2\} + \Pr\{A|B_3\} \cdot \Pr\{B_3\}$$

1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31	32	33	34	35
36	37	38	39	40	41	42

Law of Total Probability

Let S be the disjoint union of B_0, B_1, \dots . Then

$$\Pr\{A\} = \sum_{i \in N} \Pr\{A \cap B_i\}$$

$$= \sum_{i \in N} \Pr\{A | B_i\} \Pr\{B_i\}.$$

1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31	32	33	34	35
36	37	38	39	40	41	42

In-class Problem

Problem 1

6	9	13	7
12	10	8	
3	4	14	
15	5	11	2

Independence

6	9	13	7
12	10	8	
3	4	14	
15	5	11	2

Independent Events

A: Baby born at Mass General Hospital
between 1:00 am and 1:05 am.

B: Jupiter's moon IO is full.



6	9	13	7
12	10	8	
3	4	14	
15	5	11	2

Independent Events

Does Event *A* (baby is born)
have **anything to do** with
Event *B* (IO is full)?

Of course not!

6	9	13	7
12	10	8	
3	4	14	
15	5	11	2

Babies & Full Moons

So the events are *independent*:
IO phase has **no effect** on birth
frequency.

6	9	13	7
12	10	8	
3	4	14	
15	5	11	2

Babies & Full Moons

But **wait a minute**:

My sweet Aunt Daisy believed in
Astrology. She thought celestial
events could influence babies.

**We would say “nonsense,”
there's no effect.**

6	9	13	7
12	10	8	
3	4	14	
15	5	11	2

Babies & Full Moons

Wait another minute! Physics says there
IS an effect:
IO full and IO “new” are **different distances**
from Earth.

6	7	8	9
10	11	12	13
14	15	16	17
18	19	20	21

C:\42\pub\jup-radio_070115.htm

**** INFORMATION FOR AMATEUR
RADIO ASTRONOMERS ** JUPITER
DECAMETRIC EMISSIONS ****
JUPITER EPHEMERIS 01 Jul 1994,
0000UTC, Julian Day: 2449534.5, GMT
Sidereal Time: 18h35m17s

6	7	8	9
10	11	12	13
14	15	16	17
18	19	20	21

C:\42\pub\jup-radio_070115.htm

SUMMARY: Jupiter's HF emissions are
...heard on earth when Jupiter's magnetic
field "sweeps" the earth every 9h55m27s
and at other times when **Io's geometric
position influences activity.**

6	7	8	9
10	11	12	13
14	15	16	17
18	19	20	21

Babies & Full Moons

It's True: IO's **magnetic field** and
gravitational pull on the baby are
different in different phases!
But their influence on birth times
is undetectable.

6	7	8	9
10	11	12	13
14	15	16	17
18	19	20	21

Babies & Full Moons

If we compared

- **All daily birth statistics**
- **daily birth statistics** when
IO was full,

we would see **no difference!**

6	7	8	9
10	11	12	13
14	15	16	17
18	19	20	21

Babies & Full Moons

Baby frequency betw 1&1:05AM
is **same** when IO is full:
 $\Pr\{\text{Baby born 1-1:05AM} \mid \text{IO is full}\}$
 $= \Pr\{\text{Baby born 1-1:05AM}\}$
 A and B are independent!

6	7	8	9
10	11	12	13
14	15	16	17
18	19	20	21

Definitions of Independence

Definition 1:

Events A and B are independent iff
 $\Pr\{A\} = \Pr\{A \mid B\}.$

Definition 2:

Events A and B are independent iff
 $\Pr\{A\} \cdot \Pr\{B\} = \Pr\{A \cap B\}.$

6	9	13	7
12	10	5	
3	4	14	
15	8	11	2

Definitions of Independence

Equivalent:

$$\Pr\{A\} = \Pr\{A \mid B\} \quad \text{iff}$$

$$\Pr\{A\} = \frac{\Pr\{A \cap B\}}{\Pr\{B\}} \quad \text{iff}$$

$$\Pr\{A\} \cdot \Pr\{B\} = \Pr\{A \cap B\}.$$

6	9	13	7
12	10	5	
3	4	14	
15	8	11	2

Definitions of Independence

Small bug: need $\Pr\{B\} \neq 0$ for Def. 1.

Def. 2 works even if 0:

$$\Pr\{A\} \cdot \Pr\{B\} = \Pr\{A \cap B\}.$$

6	9	13	7
12	10	5	
3	4	14	
15	8	11	2

Independence

$$\Pr\{A\} \cdot \Pr\{B\} = \Pr\{A \cap B\}.$$

Symmetric! So,

A independent of B iff

B independent of A .

6	9	13	7
12	10	5	
3	4	14	
15	8	11	2

Independence

Quickies: Reflexive? Transitive?

Intuition for Symmetry?

6	9	13	7
12	10	5	
3	4	14	
15	8	11	2

Independence

A is *independent* of B means it

is independent of **whether**

or not B occurs:

A independent of B iff

A independent of \overline{B} .

6	9	13	7
12	10	5	
3	4	14	
15	8	11	2

Independence

A independent of B iff

A independent of \overline{B} .

Simple proof using:

$$\Pr\{A - B\} = \Pr\{A\} - \Pr\{A \cap B\}.$$

DO IT NOW!



The Birthday “Paradox”

Puzzle: n students in a room.

What is the probability that two students have the same birthday (month, day)

for $n = 2, 10, 23, 30, 107$?



The Birthday “Paradox”

So with 10 students have $10/365 \approx 1/30$ chance 2 have same b’day?

Not really, it’s more like $1/10$.

With 30 students, maybe $3 \cdot (30/365) \approx 1/3$ chance?

No, it’s more than **2 to 1!**



The Birthday “Paradox”

Let’s stop guessing and figure it out. Choose 2 students at random.

Pr{students have **different** birthday}?

$$= 1 - \frac{1}{365}$$



The Birthday “Paradox”

We’re assuming MIT students are **equally likely** to have each of **365 possible birthdays**.

(Also, probability student has any particular birthday is **independent of taking 6.042 this term.**)



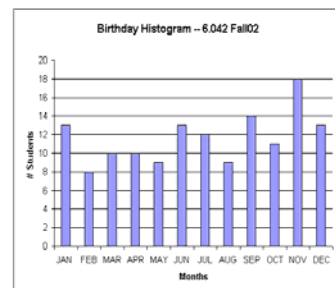
The Birthday “Paradox”

Not really same for each month:
140 students in the 6.042 class reported their birthdays.



Class Birthdays

JAN	13
FEB	8
MAR	10
APR	10
MAY	9
JUN	13
JUL	12
AUG	9
SEP	14
OCT	11
NOV	18
DEC	13
	140



6	7	8	9
10	11	12	13
14	15	16	17
18	19	20	21

Class Birthdays

November twice as popular
as February.
But close enough.

6	7	8	9
10	11	12	13
14	15	16	17
18	19	20	21

The Birthday “Paradox”

So we’ll assume that if we choose
2 students at random:

$$\Pr\{\text{students have the same birthday}\} = \frac{1}{365}$$

6	7	8	9
10	11	12	13
14	15	16	17
18	19	20	21

The Birthday “Paradox”

Choose **another** 2 students **independently** of first two.

$$\Pr\{\text{neither pair has same birthday}\}?$$

$$= \Pr\{\text{1st pair not same birthday and 2nd pair not same birthday}\}$$

$$= \Pr\{\text{1st pair not same birthday}\} \times \Pr\{\text{2nd pair not same birthday}\}$$

6	7	8	9
10	11	12	13
14	15	16	17
18	19	20	21

The Birthday “Paradox”

$$\Pr\{\text{neither pair has same birthday}\}$$

$$= \left(1 - \frac{1}{365}\right)^2$$

6	7	8	9
10	11	12	13
14	15	16	17
18	19	20	21

The Birthday “Paradox”

Choose **another** 253 **pairs** of students **independently** of first pairs.

$$\Pr\{\text{no pair has same birthday}\}?$$

$$= \left(1 - \frac{1}{365}\right)^{253} \approx \frac{1}{2}$$

6	7	8	9
10	11	12	13
14	15	16	17
18	19	20	21

The Birthday “Paradox”

But with $n = 23$ students, have

$$\binom{23}{2} = 253 \text{ pairs of students.}$$



The Birthday “Paradox”

So, with 23 students:

$$\Pr\{\text{no pair has same birthday}\} \approx \frac{1}{2}$$

$$\Pr\{\text{some pair has same birthday}\} \approx 1 - \frac{1}{2} = \frac{1}{2}$$



The Birthday “Paradox”

With 140 students

$$\Pr\{\text{no pair has same birthday}\} = \left(1 - \frac{1}{365}\right)^{\binom{140}{2}} = \left(1 - \frac{1}{365}\right)^{9730}$$



The Birthday “Paradox”

With 140 students

$$\Pr\{\text{no pair has same birthday}\} = \left(1 - \frac{1}{365}\right)^{365 \binom{140}{2}} \approx e^{-\binom{140}{2}} \approx \frac{1}{400,000,000,000}$$



The Birthday “Paradox”

In fact have 17 pairs and 2 triples of students in 6.042 with same birthday:

- Jan 1
- Jan 8
- Feb 16
- Feb 23
- Mar 3
- Mar 10
- Apr 16
- Apr 18
- May 17
- Jun 3
- Jun 9
- Jul 25
- Aug 19
- Sep 4
- Sep 22
- Oct 29
- Nov 4
- Nov 14
- Dec 21



Shared Birthdays

TK Focht	Sam Kwei	Howard Chou
Thomas Wilson	Rocco Pigneri	Gabriel Lopez-Betanzos
Jerry Ing	Robert Kwok	Timur Tokmouline
David Tsai	Michael Ogrydziak	Stephanie Tyll
Jordan Brayonov	Daniel Robey	Edana Gallagher
Amy Luxenberg	Isaac Dancy	Brendan Shields
James Tolbert	Aye Moah	Javier Velez
Alex Vandiver	Stanley Woods	David Chau
Gabriel Cunningham	Miguel Ferreira	Yi Zhang
Chris Maes	Ibrahim Tadros	Dongsung Huh
Casey Dugan	Alejandro Sedeno	Ojonimi Ocholi
Cecilia Henriquez	Enrique Zolezzi	Amanda Smith
Joanna Liang	Victor Williamson	Brian Williams
	Samir Meghani	



The Birthday “Paradox”

Wait! Whether a pair of students in 6.042 has same birthday is **not independent** of other pairs:

If (Joy, Jen) have same b’day, and (Joy, Mike) do too, then

$$\Pr\{(\text{Jen, Mike}) \text{ same b’day}\} = 1.$$

The Birthday “Paradox”

Only **non-overlapping** pairs have independent probabilities of same b’day.

The Birthday “Paradox”

But

as long as $\# \text{students} \ll \# \text{birthdays}$,
say $23 \ll 365$,
pairs w/same b’day **not likely to overlap**,
so **act like independent**.

The Birthday “Paradox”

Accurate formulas for
 $\Pr\{\text{some pair has same b’day}\}$
are in Notes 10.

In-class Problem

Problems 2 & 3
(We didn’t get to these in class.)