

### 1 Sock Drawer

**Question**  
drawer contains r red sock and b blue socks. 2 socks are drawn. **force probability to be** 1/2.

- a) how small num of red and black socks  
b) how small num of socks if num black socks is even.

**Answer**

prob first is red  $\frac{r}{r+b}$  then prob second is red given first is red  $\frac{r-1}{r+b-1}$   
so need to find r b such that  $\left(\frac{r}{r+b}\right)\left(\frac{r-1}{r+b-1}\right) = \frac{1}{2}$   
 $\frac{r}{r+b} > \frac{r-1}{r+b-1}$  so with 1/2 condition above  
 $\frac{r}{r+b} > \frac{1}{\sqrt{2}} > \frac{r-1}{r+b-1}$  so  $(\sqrt{2}+1)b+1 > r > (\sqrt{2}+1)b$

### 2 Win 2 tennis matches in a row

**Question**  
win at least 2 tennis matches in a row in a 3 set with Champion > Father  
**Q:** Choose Father-Champion-Father or Champion - Father - champion ?  
**Answer**  
Compare both sequences FCF CFC, add up the probs of winning:

F	F	F	Prob
W	W	W	fcf
W	W	L	fc(1-f)
L	W	W	(1-f)cf
Total			fc(2-f)

F	F	F	Prob
W	W	W	cfc
W	W	L	cf(1-c)
L	W	W	(1-c)fc
Total			fc(2-c)

### 3 Jury: 2 with p + random or 1 with p ?

**Answer**  
prepare table of all correct decisions:

Serious agree	p	p	not matter as overruled	$p^2$
Serious disagree 1	p	1-p	chooses right with 1/2	$p(1-p)\frac{1}{2}$
Serious disagree 2	1-p	p	chooses right with 1/2	$(1-p)p\frac{1}{2}$
Total				$p^2 + p(1-p) = p$

### 4 How many throws of dice to get 6 ?

**Answer 1 - force**  
let  $p$  = prob of 6 = 1/6 then prob of success  $p$  (len=1).  $qp$  (len2),  $qqp$  (len 3) ...  
 $m = 1(p) + 2(qp) + 3(qqp) \dots = p(1 + 2q + 3qq + \dots) = p\left(\frac{1}{1-q}\right)^2 = p\frac{1}{p^2} = \frac{1}{p}$

#### Answer 2 - First step analysis = Markov FSA

If first is failure, then m->m+1, if first is good then m=1 so


$$m = q(m+1) + p(1) \Leftrightarrow m(1-q) = q + p = 1 \Leftrightarrow m = \frac{1}{p}$$

#### Answer 3 - Martingale

...put martingale here...

### 5 throw 3/4cm diameter coin on 1cm x 1cm grided table

**Question**  
Get 5c (in all) if whole inside a square , lose 1c otherwise. CHANCE TO WIN and HOW MUCH on AVG?  
**Answer**  
Centre of coin falls in one square, so consider one square, and divide allowable area for centre by area of square

  $p = \frac{1}{4} \times \frac{1}{4}$  and  $m = (+5) \frac{1}{16} + (-1) \frac{15}{16}$

### 6 Dice Game

**Question**  
Bet on 1 or 2 or ... or 6 and throw 3 dice. Receive 1x-2x-3x stake + original stake. WHAT IS the EXPECTED LOSS ?  
**Answer**  
when you roll either all 3 diff, or 2 same, or 3 same. Bet 6 on all 6. If all 3 different then house wins 3, you lose 3 (tot 0), if 2 same h wins 1(for die=3)+1 (for die=4)+1(for 5)+1(for 6), you win 2(for 1)+1(for 2) (tot you=3-4=-1). if 3 same you win 3 house wins 5 (tot you = 3-5=-2). Then count how many ways to get 1 alike, 2 alike, 3 alike and multiply by loss.  
Total ways =  $6 \times 6 \times 6 = 216$ , all 3 different =  $6 \times 5 \times 4 = 120$ , all 3 same =  $6 \times 1 \times 1 = 6$ , therefore 2 same  $216 - 120 - 6 = 216 - 126 = 90$  [Note: 2 same (alt way) : die 1=2 and 3 dif. or (die 1=3 and 2 dif) or (die 2=3 and 1 dif) so  $6 \times 5 + 6 \times 5 + 6 \times 5 = 30 \times 3 = 90$ ] So loss for betting on all 6 = all diff + 2 same + 3 same =  $\frac{0}{6} \frac{120}{216} + \frac{(-1)}{6} \frac{90}{216} + \frac{(-2)}{6} \frac{6}{216} = \frac{-102}{216} = \frac{-17}{36}$

### 7 Follow-up Bet on outcome of initial roulette bet

**Question**  
Bet 1 number out of 38 then bet 20 ahead after 36 games. HOW MUCH IS THE WIN or LOSS ?  
**Answer**  
(expected **gain** one turn) =  $(+35)\frac{1}{38} + (-1)\frac{37}{38} = \frac{-2}{38}$  , and in 36 turns  
(expected **gain** 36 turns) =  $m_1 = (36)\frac{-2}{38} = -\frac{72}{38}$   
Now for the 20 bet: 'ahead in 36 games' = 'win once or more in 36 games' since **gain** (for win 0 times in 36) =  $36(-1) = -36 < 0$ , and **gain** (win 1 in 36) =  $1(+35) + 35(-1) = 0 > 0$  so relevant prob for the 20 bet = P(win one or more in 36)= 1- P(lose all 36) =  $1 - \left(\frac{37}{38}\right)^{36} = 0.617$  so for the 20 bet expected **gain** =  $m_2 = (+20)(+0.617) + (-20)(1 - 0.617)$  and so total **gain**  $m = m_1 + m_2 = \dots$

### 8 All cards same suit in 52 card pack

**Question**  
Probability of all 13 cards of same suit?  
**Answer 1 - straight**  
 $P = \frac{\text{good hands}}{\text{all hands}}$ . for good: pick any card , after must be of same suit =  $52 \times 12 \times 11 \times \dots \times 1 = 52 \times 12!$ , for all hands: any card then, any card left, ... (13 times)=  $52 \times 51 \times \dots \times 40 = \frac{52!}{39!}$  so Prob =  $\frac{52 \times 12!}{52!} = \frac{39!12!}{51!}$

#### Answer 2 - binomials

$P = \frac{\text{good hands}}{\text{all hands}}$ . for good: pick 1 of 4 suits, then pick 13 cards in the 13 card suits , for all, pick 13 cards in 52, so  $P = \frac{\binom{4}{1}\binom{13}{13}}{\binom{52}{13}} = \frac{(4)(1)}{39!13!} = \frac{4 \times 13! \times 39!}{52!} = \frac{4 \times 13 \times 12! \times 39!}{52 \times 51!} = \frac{12! \times 39!}{51!}$  = same as above!!

### 9 Craps game

**Game description and question**  
Only total of sum of 2 dice counts. Lose if sum=2,3,12. Win if sum=7,11. record sum otherwise, then keep throwing until either 'same sum again' (win) or 7 (lose). **Question:** odds of winning ?  
**Answer 1 - Conditional probability**

get probs of totals by counting in the matrix:

		1	2	3	4	5	6
1	2	3	4	5	6	7	8
2	3	4	5	6	7	8	9
3	4	5	6	7	8	9	10
4	5	6	7	8	9	10	11
5	6	7	8	9	10	11	12

total	2	3	4	5	6	7	8	9	10	11	12
p(total)	$\frac{1}{36}$	$\frac{2}{36}$	$\frac{3}{36}$	$\frac{4}{36}$	$\frac{5}{36}$	$\frac{6}{36}$	$\frac{5}{36}$	$\frac{4}{36}$	$\frac{3}{36}$	$\frac{2}{36}$	$\frac{1}{36}$

so  $P(\text{win 1st throw}) = P(7) + P(11) = \frac{6}{36} + \frac{2}{36}$  and  $P(\text{loss 1st throw}) = P(2) + P(3) + P(12) = \frac{1}{36} + \frac{2}{36} + \frac{1}{36}$  then after first throw only: throwing either 'initial sum again' (which was either=4,5,6,8,9 or 10) (win) or 7 (lose) matters, so we have a conditional prob on first throw. Say the 'initial sum was 4', then win if 4, or lose if 7, so P(win if init sum=4)= $P(\text{win}|4) = \frac{\text{num ways of 4}}{\text{num ways of 4 or 7}} = \frac{3}{3+6}$  so  $P(\text{win if 4}) = P(4) \times P(\text{win}|4)$ , so in total  $P(\text{win}) = P(7) + P(11) + P(4) \times P(\text{win}|4) + P(5) \times P(\text{win}|5) + P(6) \times P(\text{win}|6) + P(7) \times P(\text{win}|7) + P(8) \times P(\text{win}|8) + P(9) \times P(\text{win}|9) + P(10) \times P(\text{win}|10)$  and expected gain =  $(+1) \times P(\text{win}) + (-1) \times P(\text{loss})$   
**note: Answer 1' - infinite summation method untill you get the init sum or 7**  
if into 2nd or more throw , you have the possibilities P(init sum again), P(ignore ie not count), or P(7), and win if 'init again', or, 'not count'+ 'init again, or, 'not count' 'not count' then 'init again' etc. So say init sum was 4 (same as above), then  $P(\text{win}|init sum=4) = P + RP + RRP + \dots$  with  $P = \text{prob}(\text{init sum of 4 again})$  and  $R = \text{prob}(\text{not count})$ , which is  $P(1+R+RR+\dots) = P/(1-R)$  , so in summary to win with a 4 then  $P(4) \times P/(1-R)$  with  $P=3/36$  and  $R=1-P(4)-P(7)=1-3/36-6/36$  - note  $P/(1-R) = P/(P+Q) < 1$  if  $Q = \text{prob}(7)$

### 10 Which game do you prefer

**Question: prefer known contents or unknown contents?**  
game1:urn1:10 black balls,urn2: 10 white balls, pick a colour  
game2:urn1:unknown,urn2: urn2, pick a colour  
**Answer: same**  
game1:  $P(\text{win}) = P(\text{urn1})P(B|\text{urn1}) + P(\text{urn2})P(B|\text{urn1}) = 1/2 \times 1/2 + 1/2 \times 1/2 = 1/2$  for B=black, same for W  
game2:  $P(\text{win}) = P(\text{urn1})P(B|\text{urn1}) + P(\text{urn2})P(B|\text{urn1}) = 1/2 \times x + 1/2 \times (1-x) = 1/2$  for B=black, same for W because  $x = \blacksquare / \text{total}$  so in urn2:  $(\text{total} - \blacksquare) / \text{total} = 1 - x$

### 11 Prisoner's dilemma

**Question - find the flaw in this argument**  
3 prisoners A,B,C and 2 will be released. Warden knows. if A asks W, W will name 1 other than A. A thinks his chance before asking =2/3, and if Warden say 'B' then chance now = 1/2 < 2/3, hence should not ask. Where the flaw ?

**Answer: list ALL events, must condition on the Warden**

Num	Release Outcome	Warden	Prob outcome AND W	example W says B
1	A,B	C must	(1/3)(1)=1/3	
2	A,C	B must	(1/3)(1)=1/3	ok
3	B,C	B	(1/3)(1/2) = 1/6	ok
4	B,C	C	(1/3)(1/2) = 1/6	

so  $P(A \text{ released} | W \text{ says B}) = P(A \text{ released and } W \text{ says B}) / P(W \text{ says B}) = \text{row2}/(\text{row2}+\text{row3}) = (1/3)/(1/6+1/3) = (1/3)/(3/6) = 6/9 = 2/3$  = same as without asking similarly  $P(A \text{ released} | W \text{ says C}) = P(A \text{ released and } W \text{ says C}) / P(W \text{ says C}) = \text{row1}/(\text{row1}+\text{row3})$  = same since same probs = same as without asking

### 12 Coupon Collector

**Question: How many boxes required to collect all 5 coupons**  
5 possible coupons 1..5, 1 per box, how many boxes on average to get all 5?  
**Answer: See FSA problem 4 - num throws to get a 6 = 1/(1/6)=6**  
1st box always good. second box:new number with prob (4/5) → from FSA prob 4 must wait 1/(4/5)=5/4, third box: new number with prob (3/5) → must wait 1/(3/5)=5/3 etc so answer  $5/4 + 5/3 + 5/2 + 5/1 = 5(1/4 + 1/3 + 1/2 + 1)$ . Note  $1 + 1/2 + \dots + 1/n = \ln n + \frac{1}{2n} + \text{euler}$  so  $n \ln n + 1/2 + n\gamma \approx n \ln n + n\gamma$  for big n

### 13 Theater Row - pairs of adjacent but different

**Question: How many pairs of adjacent but different**  
8 B and 7 M in a row, how many pairs of BM or MB on average? For example BMBMMMMMMBBBB is 3 good pairs. **Then same question with 6B 5M 4W**  
**Answer1: prob 2 balls are adjacent x num of good pairs**  
prob 2 balls in the 15 are adjacent = 14 slots possible / (15 choose 2) , then num pairs=8x7=56 so  $\frac{14}{\binom{15}{2}} (56) = \frac{14}{15 \times 14} (56) = (2) \frac{56}{15}$  . For next one first part is exact same

!, just more pairs=(6x5+6x4+5x4)  
**Answer2: indicator variable + linearity of expectation even though the  $X_i$  not independent!!**  
score 1 if slot 1,2 = good, 0 otherwise, and same for slot 2,3 etc (← the indicator variable).  
First slot 1,2 is good if (BM or MB) ie  $\frac{8}{15} \frac{7}{14} + \frac{7}{15} \frac{8}{14}$ , same for slot 2,3 ... slot 14,15 so  $14(\frac{8}{15} \frac{7}{14} + \frac{7}{15} \frac{8}{14}) = (2) \frac{56}{15}$  (← linearity of expectation even if not independent!!)

### 14 2<sup>nd</sup> Tennis tournament with elimination

**Question: Prob second-best makes it to runner-up?**  
 $2^3 = 8$  players, better one always defeats next best. **Question:** prob second best is in final ?  
**Answer: Second best must be in lower half to meet the best in the final** (where he will be defeated of course)

1 2 3 4 5 6 7 8 (← second-best must occupy a lot in lower half to win it)=  
 $\frac{\text{good slots for 2nd best}}{\text{possible slots for 2nd-best - keep 1 for best}} = \frac{2^{n-1}}{2^n - 1}$

### 15 2<sup>nd</sup> tournament - prob of meeting at all

**Question: Chance of meeting in tournament**  
**Answer: enumerate**  
1 2 3 4 5 6 7 8 <=  $\frac{1}{2}$  chance, and they meet with prob 1,1 3 or 1,4 the rest <=  $\frac{1+1}{2}$  chance, and they meet with prob  $\frac{1}{2} \times \frac{1}{2}$  as they both have to win, finally bottom half: 1 5,6,7,8 with prob  $\frac{1+1+1+1}{2 \times 2 \times 2 \times 2}$  as they both have to win their matches and meet in final, so  $\frac{1}{2}(1) + \frac{2}{2} \frac{1}{4} + \frac{4}{2} \frac{1}{16} = \frac{1}{4}$ . Can prove general case by induction.

### 16 Bernoulli trial - prob of given number

**Question: throw 100 fair coins, prob of 50 heads exactly?**

**Answer:**  $\binom{100}{50} (\frac{1}{2})^{100} = \frac{100!}{50!50!} (\frac{1}{2})^{100}$

use sterling approximation to evaluate  $n! = \sqrt{2\pi n} n^{n+1/2} e^{-n}$

### 17 1 6 with 1 dice, 2 6s with 2x6 dice, 3 6s with 3x6 dice?

**Answer: enumerate the probs for 1, 2 6s,**

prob of 1 6 exactly with 6 dice: (6 choose 1)(1 6 exactly) =  $\binom{6}{1} \frac{1}{6} (\frac{5}{6})^5$  , prob of x 6s exactly with n dice: (n choose x)(x 6s exactly in n trials) =  $\binom{n}{x} \frac{1}{6}^x (\frac{5}{6})^{n-x}$

### 18 3 way duel

**Question**  
A,B,C fight duel. A shoots and wins with prob 0.3, B with prob 1, C with prob 0.5. Best strategy for A ?

**Answer: enumerate the options**

if A shoots C , B will shoot A so no good - if A shoots B and misses then B will choose to shoot C since C better than A, then A gets to shoot B with his prob =0.3 - if A shoots B and wins, then C <-> A <-> C <-> A ... untill one dies, and the prob sequence is P(A eventual win)= P(A terminates the sequence) = (C miss, A wins) + (C miss, A miss, C miss, A wins) + ... = (.5).(3) + (.5)^2(.7).(3) + (.5)^3(.7)^2(.3) + ... = (.5).(3)((geometric of .5 .7) < 0.3 so A should deliberately miss B and let B take care of C and then try hitting B with his prob 0.3

### 19 Sample with and without replacement

Urn A has 2R 1B, Urn B has 101 R,100 B. try and guess the right urn based on 2 draws from same urn: 1st draw, see the colour, choose to replace it or not replace it before draw again form same urn. which is best ?

Answer: enumerate

if 1st is red and urn 1, then 1B-1R and if urn2 100B -100R so 2nd draw from same urn is the same, so cannot tell which urn <- put it back if red  
if 1st is black, then if no replace, then the probs depends on the sequence of colours observed as follows:

	prob it is urn A	prob it is urn B	biggest
R*,R	(choose A)(R)(R) = $\frac{1}{2} \times \frac{2}{3} \times \frac{2}{3}$	$\frac{1}{2} \times \frac{101}{201} \times \frac{101}{201}$	urn A
R*,B	$\frac{1}{2} \times \frac{2}{3} \times \frac{1}{3}$	$\frac{1}{2} \times \frac{101}{201} \times \frac{100}{201}$	B
B,R	$\frac{1}{2} \times \frac{1}{3} \times \frac{1}{1}$	$\frac{100}{201} \times \frac{101}{201} \times \frac{1}{1}$	A - note the no rep
B,B	$\frac{1}{2} \times \frac{1}{3} \times 0$	$\frac{100}{201} \times \frac{101}{201} \times \frac{1}{1}$	B - note the 0 in A

### 20 Ballot theorem - part 1 - vote counting

Question suppose candidate A has more votes than B: a>b. Prob of having same number at least once at some point during the vote counting?

Answer

We know A does eventually win so ALL sequences with B starts first are good sequences, since there is eventual hit-and-overtake by A. All sequences with B first= $\frac{b}{a+b}$ . Now each sequence has a mirror : B <-> A, so there is same number of sequence starting with A with eventual equal tally (then A wins). There are no other good sequences with A start else they would have a mirror and we have already counted all the mirrors. so answer =  $\frac{2b}{a+b}$

### 21 Ballot theorem - part2 - Bernoulli sums

Question: Bernoulli sums of 1,-1 - prob of no tie

Answer: for even N=2n ..., prob a string x prob of a tie as per above

Prob of x wins:  $\binom{N=2n}{x}$  each string prob  $\frac{1}{2^N}$  so  $\binom{N=2n}{x} \frac{1}{2^N}$ , and to use part 1 we need a win, so if x<=n -> loss -> use part 1 direct -> prob of a tie =  $\frac{2^N}{2^N}$ , if x<=n -> loss -> convert to loss to use part 1 -> -> prob of a tie =  $\frac{2(N-x)}{2^N}$  then add up the possibilities x=0..n  $\binom{N=2n}{x} \frac{1}{2^N} \frac{2x}{N}$  and for x =n+1..N  $\binom{N=2n}{x} \frac{1}{2^N} \frac{2(N-x)}{N}$  then expand out and remember fact that  $(1+1)^N = 2^N = \sum \binom{N}{x}$

### 22 Subway arrival

Answer: train1 arrives 3:00 3:10..., train 2 arrives 3:02 3:12... - must arrive in good interval to catch1 before 2

### 23 prob(length Random Chord) > radius

Answer: several possibilities



(2) midpoint of chord less than altitude of regular hexagon =  $\frac{\pi d^2}{\pi r^2} = (\sqrt{3}/2)^2 = 3/4$

(3) 2 random points on circle : given 1 point , second must fall either way of corresponding arc subtended by hexagon = 2 x 1/6 = 1/3 so bigger than radius = 1-1/3=2/3

### 24 probability of meeting if each arrive between 6/7am and stay 5mins

Answer: stretch of time between y = x + 1/12 and y = x - 1/12 with x=0..1

because y can arrive either way of [x-1/12, x+1/12] with x 0..1 and constraint 0<y<1

### 25 fixed number of urns with sampling - part1

100 coins per urn, 1 fake coin per urn, draw 1 coin per urn, prob of detecting one false coin?

Answers

probability of no false coins in all 100 urns with 1 false coins per urn  $(1 - \frac{1}{100})^{100}$ , for n:  $(1 - \frac{1}{n})^n$ , probability of no false coins in all n urns with m false coins  $(1 - \frac{m}{n})^n \rightarrow e^{-m}$

### 26 multiple urns with sampling - part 2 – POISSON DISTRIBUTION INTRODUCTION

n coins per urn, m fake coins per urn, draw 1 coin from the n urns, prob of drawing exactly r false coins?

Answers

r events each with prob  $p = m/n$  so P= (n choose r) (prob of a string of r good and n-r bad) =  $\binom{n}{r} \left(\frac{m}{n}\right)^r \left(1 - \frac{m}{n}\right)^{n-r}$ , then with n large and m and r fixed

$$\left(\frac{n}{n}\right)^r \left(1 - \frac{m}{n}\right)^{n-r} = \frac{1}{r!} \frac{n(n-1)(n-r+1)}{n^r} m^r \left(1 - \frac{m}{n}\right)^n \left(1 - \frac{m}{n}\right)^{-r} = \frac{1}{r!} m^r e^{-m}$$

which is the POIS-

SON distribution  $P(r) = e^{-m} \frac{m^r}{r!}$  r=0,1,2... - NOTE: large n -> means r can be very

large,= $P(0) = e^{-m}$

### 27 POISSON: Fixed number of colonies per plate with plates divided into small

Question1: large number of plates, fixed average m=3 number of colonies per plate, how many plates with exactly m=3 colonies ? Question 2: let m=3 be large, what happens ?  
divide each plates into large number of small subplates, let p = prob = num colonies per sub-plate, then there on a plate  $m = 3 = (\text{num sub plates})(\text{prob per sub plate}) = np$  ie np stays constant. Then if prob of r colonies in 1 plate = n sub-plates, with each colony = prob p per sub-plate is Bernoulli experiment !

So  $P(r) = \binom{n}{r} p^r (1-p)^{n-r}$  with  $np = 3 = m \rightarrow p = \frac{m=3}{n}$  So  $P(r) = \binom{n}{r} \left(\frac{3}{n}\right)^r \left(1 - \frac{3}{n}\right)^{n-r}$  with  $n \rightarrow \infty$

See Question 26 ! POISSON distribution  $P(r) = e^{-m} \frac{m^r}{r!}$  m=3 and r=0,1,2... , Now set m=3 , and then r=3=exact number to answer the question.

Actually m=3 is the mean of the POISSON distribution:  $mean = \sum_0^\infty xP(x) = \sum_{r=0}^\infty rP(r) = \sum_{r=0}^\infty r e^{-m} \frac{m^r}{r!} = \sum_{r=1}^\infty e^{-m} \frac{m^r}{r-1!} = m e^{-m} \sum_{r=1}^\infty \frac{m^{r-1}}{r-1!} = m e^{-m} \sum_0^\infty \frac{m^r}{r!} = m e^{-m} e^m = m$

Again : POISSON distribution  $P(r) = e^{-m} \frac{m^r}{r!}$  r=0,1,2... . [Check out what happens

when mean  $m \rightarrow \infty$  :: Use sterling formula for r! with  $r=m \rightarrow \infty$  ie  $r! = \sqrt{2\pi r} r^{r+\frac{1}{2}} e^{-m}$  so  $P(r=m) = e^{-m} \frac{m^m}{m!} = e^{-m} \frac{m^m}{\sqrt{2\pi m} m^{m+\frac{1}{2}} e^{-m}} = \frac{1}{\sqrt{2\pi m}}$

### 28 POISSON: Sell m=20 cakes per round - Prob of selling even number of cakes

Number of cakes sold per round = POISSON distribution =  $P(r) = e^{-m} \frac{m^r}{r!}$  and 'selling evens' means r=0,2 or 4 etc so of course answer =  $\sum_{r=\text{even}}^\infty P(r)$  now use expansions of  $e^m = \sum \frac{m^r}{r!}$  and  $e^{-m}$  to eliminate odd terms and divide by 2, and with the  $e^{-m}$  in front of each expansion you get  $\frac{1}{2}(1 + e^{-2m})$  and set m=20 in there for the answer.

### 29 BIRTHDAY problem: smallest num. of people required in group for at least 2 of them in the group to have same birthdate with prob > 1/2

find prob of no person having same birthdate in group, take complement.  
If N=365 birthdates, first person in group has N dates to choose from, second has (N-1) dates to choose from ... r th person has (N-r+1) dates to choose from so  $N(N-1) \dots (N-r+1)$ , to be divided by each person having N dates to choose from =  $N^r$  so  $\frac{N(N-1) \dots (N-r+1)}{N^r}$  with N=365 and try r such that the prob < 1/2 so that 1-prob > 1/2

approximation:  $e^{-x} = 1 - x$  x small and  $\frac{N(N-1) \dots (N-r+1)}{N^r} = (1 - \frac{1}{N})(1 - \frac{2}{N}) \dots (1 - \frac{r-1}{N})$  so

$$e^{O} e^{-\frac{1}{N}} e^{-\frac{2}{N}} \dots e^{-\frac{r-1}{N}} = e^{-\frac{\sum_{i=0}^{r-1} i}{N}} = e^{-\frac{r(r-1)}{2N}}$$

### 30 PERSONAL BIRTHDAY problem: how many people needed in group for one in group to have same birthday as you with prob > 1/2

Note difference: need person in the group to have same birthday as you - NOT same birthday as each other (and different from you). this is the PERSONAL birthday problem.

say N=365 then Each person has  $\frac{N-1}{N}$  chance NOT having your birthday, so in group of people : (not having you birthdays) (not having you birthday) .. (not having your birthday)=( $\frac{N-1}{N}$ )<sup>r</sup> so 1 of them has your birthday =  $1 - (\frac{N-1}{N})^r$ , now find r by trial and error such that this > 1/2 for N=365

approximation : same thing,  $e^{-x} = 1 - x$  for small x so  $1 - (\frac{N-1}{N})^r = 1 - (1 - \frac{1}{N})^r = 1 - e^{-\frac{r}{N}}$  then set = 1/2, use logs.

### 31 BIRTHDAY problem: link the 2 above

- each person in personal birthday problems gives 1 chance to match your personal birthday

- each person in group shared birthday problem has r-1 chances to have same birthdate as someone else -> r(r-1)/2 pairs

- with the approximation set  $n = r(r-1)/2$  so that both probs are equal

### 32 BIRTHDAY problem: whole group gets a holiday if one of them has a birthday. how large the group to have max number of working days = num people x num days worked ?

- Note: group of 1 : only gets 1 holiday per year -> 1 person works 364 days -> 1x364 days

- Note: group of 2 : each gets 2 holiday per year -> 2 people work 2 x 363 days

- Note: group massive : every one gets holidays whole time-> massive x 0 days = 0 days worked

- so max is in between somewhere [2... massive] - but where ?  
- Answer : everyone works same number days (days when there are no birthday), so E(num days worked) = (num people) x E(num days worked by 1 person) = (num people) (num days in year) prob(day is working day) = nN [(not a birthday for person1) (not a birthday for person2)...(not a birthday for person n)]=  $nN(1 - \frac{1}{N})^n$  and find which n gives max for N=365  
- note more rigorous : expected (num days offered by first working day for n people) = n x [(+1)xProb(+1)+(+0)xProb(+0)] =  $n \{ (+1)(1 - \frac{1}{N})^n + (+0)(1 - (1 - \frac{1}{N})^n) \}$   
- so max  $xp^x$ , turns out x=N so  $N^2(1 - 1/N)^N = N^2 e^{-N/N} = N^2 e^{-1}$  so just  $e^{-1}$  per worker per day with N workers and N days

### 33 RANDOM WALK ON INTEGER LINE - CLIFFHANGER: 1 step away from falling, prob p of stepping right=away

Note: possible paths: 1->0, 1->2->1->0, 1->2->1->2->1->0 etc  
FSA Answer: FSA: prob (x=0|start=1) = prob (left)+prob (step right) prob (x=0|start=2)=(1-p) $P_1$  +  $pP_2$  but  $P_2$ =prob (x=0|start=2)=P[all paths that go from 2 to 0 somehow]=P[all paths that go from 2 to 1 somehow AND all paths that go from 1 to 0 somehow] = P[all paths that go from 2 to 1 - somehow] x P [all paths that go from 1 to 0 - somehow] =  $P_1 P_1$  (because markov and going form 1 to 0 somehow = going from 2 to 1 somehow) [Note: somehow means : in any way, maybe numerous steps like above] , anyway we get  $P_1 = (1-p) + pP_1^2$  so  $P_1$  is either 1 or  $\frac{1-p}{p}$  and P must be <1 hence =1 for  $p < 1/2$  and =  $\frac{1-p}{p}$  for  $p > 1/2$

Note: for  $p = 2/3$  this is 1/2 and  $p = 1/2$  this is 1 - implication for casino:  $P_1 = 1/2$  to avoid bankruptcy requires you to have 2/3 chance of winning... tons of paths can lead you to x=0 / bankruptcy

FSA Answer general:  $P_2 = P_1^2$  so  $P_n = P_1^n$  so P(x=0|start m)=1 or  $(\frac{1-p}{p})^m$  Martingale

Answer: use de Moivre martinagle (p/q) ...

### 34 RANDOM WALK ON INTEGER LINE - GAMBLER RUIN: 2 players M,N play each other, winning odds: p(M win)=1/3<p(N win)=2/3, and initial fortune: M=1<N=2. they play +/- until one bankrupt. what prob (M=ultimate winner) ? Answer: DOUBLE USAGE of the above

- M starts with m=1 and N starts with n=2. Random walk on integer, and When x=0 then M bankrupt, when x=m+n then M win

- from above with unlimited resource ie  $n = \infty$  then x=0 ie bankrupt with prob  $\frac{q}{p}$

- but 2 ways to reach x=0 = go bankrupt , (1) paths that always stay < m+n and (2) paths that reach m+n and then go back to 0. If let Q = paths that always stay < m+n, then if do reach m+n it is like a new start at x=m+n and we know already that these will go back to x=0 with prob  $\frac{q}{p}^{m+n} \leftarrow$  double usage of the above

- so basically prob x=0 with  $n=\infty = \frac{q}{p}^m = Q + (1-Q)\frac{q}{p}^{m+n} \leftarrow$  solve for Q and P=prob of reaching m+n ever = 1 - prob stay below m+n = 1-Q

- answer =  $P = \frac{1 - \frac{q}{p}^m}{1 - \frac{q}{p}^{m+n}}$  and with p=q=1/2 we get 0/0 and with l Hospital rule =  $\frac{m}{m+n}$

### 35 start with 20 \$ and want to reach \$40: 20\$ on evens in one go or bet 1\$ on even each time ?

-Answer: bet 1\$ each time = random walk on integer line same as above m=start=20, want extra n=20, prob p = 18/38 and so q=1-p=20/38 - so use formula above for 1\$ at a time and compare with all in one go = p = 18/38

### 36 PRINCIPLE - drop n points on a circle - then all symmetric ie length of (n+1) segments have identical distributions

### 37 Mark sticks of length L with blue and red dots at the end , break sticks in 3 places, average length of blue-dot bit ?

Answer : equally distributed so L/3

### 38 52 cards, how many cards till first ace ?

4 aces -> 5 segments of 0-48 -> 48/5 cards + ace

### 39 German tanks 1..N, see n=60 so what is N?

Answer 1: 1 point dropped in 1..N-> your n creates 2 segments -> symmetry -> 2 segments of 1..59 + your obs -> 2x59+ the one you see = 2x59+1=119// Answer 2: prob of sample containing the max =  $(1 \times (N-1)) / \binom{N}{2} = 2/N$ , max likelihood = make that prob biggest -> N=60 = as small as possible = what you see = n// Answer 3: confidence interval = P(n you see>N/x)=some value ) eg P(n>2/3 N)=1/3-> ???

### 40 German tanks 1..N, see 5 numbers n1...n5=60 so what is N?

Answer 1: 5 points -> 6 segments -> average length of (60-5)/5=11 -> N=60+11=71



#### 41 break stick at random in 2 places, average length of smallest stick ?

Answer 1 break in 2 -> each segment average length L/2 by PRINCIPLE, now smallest = if break point left -> 1/2 x length of left = 1/2 x 1/2 = 1/4  
Answer 2: Smaller stick has length x which is uniformly distributed in the range [0,0.5]. The probability distribution of x is p(x) = 1/(b-a) = 1 / [0.5-0] = 2. Yes it is a pdf,  $\int_0^{0.5} 2dx = 1$ . So  $E[x] = \int xp(x)dx = \int_0^{0.5} x(2)dx = 2\left[\frac{x^2}{2}\right]_0^{0.5} = 0.25 = 1/4$ .

#### 42 break stick at random in 2 places, average length of ratio of lengths ?

assume fell on right then x [1/2 .. 1] uniform dist 1/(b-a)=2 so  $2\int_{1/2}^1 \frac{1-x}{x} dx = 2\ln(2) - 1$

#### 43 break stick at random in 2 places, average length of smallest middle, largest ?

- from PRINCIPLE : break in 2 places -> 3 segments with uniform distribution -> average length of each segment = L/3  
- however: so what ? we want SMALLEST and SMALLEST (3 uniforms) NOT uniform !! DIFFERENT from case above where the min was directly the distribution so was uniform  
- Answer 0: complicated geometry methods with centroids  
- Answer 1 FOR MIN:  
• let  $z = \min(x,y-x,1-y)$  = minimum length of the stick and  $P(z>a) = \text{prob } z > a$   
•  $P(z>a) = 2 * P(x>a, y-x>a, 1-y>a) = 2 P(x>a, a+x < y < 1-a) \leftarrow 2$  because have to consider case  $x < y$  and  $y < x$  - note MAX bit NOT entering yet thisis a general relation  
• FIRST:  $a+x < y < 1-a \rightarrow x < 1-2a$  so  $a < x < 1-2a \rightarrow$  must have  $a < 1/3$  (*Leftarrowarrow* obviously right , the min length will be less than 1/3 with 3 segments)  
• SECOND:  $P(z>a) = 2 * 2 P(x>a, a+x < y < 1-a) \rightarrow P(z>a) = 2 \int_a^{1-2a} \int_{a+x}^{1-a} dy dx \leftarrow$  (  $y \leftarrow$  first, then x)  $\Rightarrow P(z>a) = 2 \int_a^{1-2a} (1-2a-x)dx = 2((1-2a)(1-2a-a) - 1/2((1-2a)^2 - a^2)) = 2(1-2a)(1-3a) - (1-3a)(1-a) = (1-3a)(2(1-2a) - (1-a)) = (1-3a)(1-3a) = (1-3a)^2$   
• CONCLUSION:  $P(z>a) = (1-3a)^2$  so  $P(z=a) = 1 - P(z>a) = 1 - (1-3a)^2$  so p(a) = derivative of  $1 - (1-3a)^2 = 6 - 18a = 6(1-3a) \leftarrow$  btw : g'of x f' = (-2)f x f' = (-2) (1-3a)(-3) = 6(1-3a) and  $E(a) = \int ap(a)da = \int_0^{1/3} 6(1-3a)da \leftarrow$  again remember  $0 < a < 1/3$  from above - integration LIMITS !!  
- Now Answer 1 (ie calculus) FOR MAX: similar but stick to  $P(z<a)$   
• let  $z = \max(x,y-x,1-y)$   
•  $\text{Pr}(z < a) = \text{Pr}(x < a, y-x < a, 1-y < a) = \text{Pr}(1-2a < x < a, 1-a < y < x+a) \leftarrow$  EXACT SAME AS ABOVE - the MAX bit has not entered yet • max bit now : ???

#### 44 your (P win) < P(lose) - How many 2n games to play to max your chances of winning?

- n+1 or more games in 2n to win so  $P(\text{win in } 2n) = P_{2n} = \sum_{(k>n+1)}^{2n} p^k q^{n-k}$
- what 2n that maximises that sum?
- if go on to n+2 and not stop at n, it must be because it is better for you, ie  $P(\text{win in } 2n+2) > P(\text{win in } 2n)$
- but 2n+2 games = 2n games + another 2
- in these 2 extra games your status changes in 2 cases only
- case 1: won n+1 in 2n but lose both 2 : then from winner -> loser and you have reduced the prob by (lose x lose x n+1 wins in
- case 2: won only n in 2n but win both 2 : then now from loser -> winner
- and explicitly  $P_{2n+2} = P_{2n} - P(2 \text{ losses}) P(\text{won } n+1 \mid 2 \text{ losses}) + P(2 \text{ wins}) P(\text{won } n \mid 2 \text{ wins})$  and note  $P(\text{won } n+1 \mid 2 \text{ losses}) = P(\text{won } n+1)$  because it is independent and same for the other and note ht - because that possibility REDUCES your prob of win and the other INCREASES it
- and so explicitly  $P_{2n+2} = P_{2n} - q^2 \binom{n+1}{2n} p^{n+1} q^{n-1} + p^2 \binom{2n}{n} p^n q^n \leftarrow$  note the MINUS to REDUCE the prob of winning and the PLUS
- and for optimal 2n we want  $P(2n) > P(2n-2)$  and also  $P(2n) > P(2n+2)$
- and for this to happen the added bits need to be positive/negative etc...

#### 45 MATCHING PROBLEM: 52 cards laid out, then another 52 cards laid out beneath - AVERAGE NUMBER of matches ?

- COUNTING problem -> INDICATOR variables
- each card:  $1xP(\text{match}) + 0xP(\text{not match}) = 1x(1/n) + 0x\text{whatever} = 1/n$  so n cards = n x 1/n = 1 (yes - don't care what comes before - E(sum of X) = sum of E(X) even if the Xs are dependent - so here what turns up IS dependent but the average is NOT dependent)

#### 46 MATCHING PROBLEM: secretary puts letters in envelopes at random : SAME PROBLEM - SAME AVERAGE

#### 47 MATCHING PROBLEM: 52 cards laid out, then another 52 cards laid out beneath - PROBABILITY of num matches=r (not JUST the AVERAGE over all the probs as per above) ? this is a DERANGEMENT problem

- $P(r \text{ matches in } n \text{ cards}) = (\text{prob } 1\text{st card matches}) \times (\text{prob } 2\text{nd card matches}) \dots (\text{prob } r\text{th card matches}) \times (\text{choose } r \text{ cards in } n) \times \text{PROB}(\text{no match in } n-r) \rightarrow P(r|n) = \frac{1}{n} \frac{1}{n-1} \dots \frac{1}{n-r+1} \binom{n}{r} P(0|n-r) = \frac{1}{r!} P(0|n-r)$
- $P(0 \text{ matches in } n \text{ cards}) = \text{num derangement of } n \text{ cards} / \text{num card arrangements} = \text{num derangement of } n \text{ cards} / n!$
- DERANGEMENT = (1st card not in place) AND (2nd card not in place) AND .. (nth card not in place) =  $\text{Num}(T1^c \cap T2^c \cap \dots Tn^c) = \text{Num}(\text{everything}) - \text{Num}(T1 \cup T2 \cup \dots \cup Tn) = |S| - \sum_i |T_i| + \sum_{i<j} |T_i \cap T_j| - \sum_{i<j<k} |T_i \cap T_j \cap T_k| + \dots + (-1)^n |T_1 \cap \dots \cap T_n| = n! - \binom{n}{1}(n-1)! + \binom{n}{2}(n-2)! - \binom{n}{3}(n-3)! + \dots + (-1)^n \binom{n}{n}(n-n)! = n! - \frac{n!}{1!} + \frac{n!}{2!} - \frac{n!}{3!} + \dots + (-1)^n \frac{n!}{n!} = n! \left[ 1 - \frac{1}{1!} + \frac{1}{2!} - \frac{1}{3!} + \dots + (-1)^n \frac{1}{n!} \right]$ .
- so prob =  $\frac{1}{r!} \text{Derangements } \frac{1}{n!} = \frac{1}{r!} \left[ 1 - \frac{1}{1!} + \frac{1}{2!} - \frac{1}{3!} + \dots + (-1)^{n-r} \frac{1}{n-r!} \right] \leftarrow$  goes to 1/e 1/r!

#### 48 DECIDE IF MAXIMUM part 1: review N slips 1 by 1, decide if biggest or move on, if decision = actual biggest, then get it else get 0 - BEST STRATEGY ?

- OPTIMAL POLICY : skip some , then select best so far : REASON: prob =k/n of having seen the max increases from 1/n to 1 but prob of winning decreases as we get near the end (and at the end it is just 1/n) so must be in the middle and any subsequent choice after your pick must be false so whatever criterion you choose must be 'pick best so far and statement[k..n] is true if the true max is later', so best policy is 'skip then pick'
- given optimal policy, the question is HOW MANY TO SKIP (s-1) before picking the subsequent max so far (at k) :
- we want  $P(\text{win with draw } k = k \text{ is max so far}) > P(\text{win pick something after})$
- $P(\text{win at } k = k \text{ is the max}) = 1/n$
- $P(\text{max of the } k-1 \text{ numbers seen so far is in the } s-1 \text{ skipped - else we have lost}) = (s-1)(k-1)$
- hence P (picking the maximum with the skipping strategy) =  $\frac{1}{n} \sum_{k=s}^{n-1} \frac{s-1}{k-1}$
- hence to choose best we want  $P(\text{win with draw } s = s \text{ is max so far}) > P(\text{win by picking something after } s)$
- ie  $s/n > \frac{1}{n} \sum_{k=s}^{n-1} \frac{s-1}{k-1} = \frac{s}{n} \left[ \frac{1}{s} + \frac{1}{s+1} + \dots + \frac{1}{n-1} \right]$
- note limit:  $\frac{s}{n} \left[ \frac{1}{s} + \frac{1}{s+1} + \dots + \frac{1}{n-1} \right] \equiv \frac{s}{n} \ln\left(\frac{n}{s}\right) \rightarrow 1/e = s/n$  so cutoff  $s \equiv n/e$

#### 49 DECIDE IF MAXIMUM part 2: same as before : review N slips 1 by 1, decide if biggest or move on, if decision = actual biggest, then get it else get 0 BUT the number on the slip is uniformly distributed !- BEST STRATEGY NOW ?

- QUICK NOTE: before, did not know the dist of the dowry amounts. now we know the dist of the numbers. So say first number you get is 0.999, then prob (that this is > than next 99 numbers) = complement of (all number < 0.999) = 1 -{ (2nd num < .999) and (3rd num < .999) .. } = 1 - (0.999)^99
- on this problem, work backward:

- last draw : if biggest so far, then choose it (deterministic)
- one draw before last : only one number can beat it (the last one), so if > 1/2 choose it, if not leave it, because if < 1/2 then prob (last one > 1/2) is > 1/2
- 2 draws before last: then only next 2 draws can beat it. say current value is x then
  - both bigger :  $(1-x)^2$
  - one bigger, one smaller :  $x(1-x) + (1-x)x = 2x(1-x)$
  - both smaller:  $x^2$
  - so prob of winning later is (CAREFUL) : (both bigger AND WE CHOOSE THE RIGHT ONE  $\leftarrow$  ie prob  $\frac{1}{2}$  ) + (ONE BIGGER  $\leftarrow$  so we are sure to choose it) =  $\frac{1}{2}(1-x)^2 + 2x(1-x)$
  - so chance of winning later =  $\frac{1}{2}(1-x)^2 + 2x(1-x)$
  - chance of winning now = now is bigger than later 2 = (bigger than next one) and (bigger than last one) =  $x.x = x^2 \leftarrow$  uniform dist everywhere in this problem !
  - FINALLY : solve  $x^2 = \frac{1}{2}(1-x)^2 + 2x(1-x)$  and choose candidate ie if bigger than solution

- n draws before last: same reasoning , end up solving  $x^r = \binom{r}{1}x^{r-1}(1-x) + \frac{1}{2}\binom{r}{2}x^{r-2}(1-x)^2 + \dots + \frac{1}{r}\binom{r}{r}x^{r-r}(1-x)^r$
- approx: r big and  $x > 1/2$  (always wait for this) then  $1-x$  gets small so  $x^r$  = first term =  $\binom{r}{1}x^{r-1}(1-x) \rightarrow x^r = rx^{r-1}(1-x) \rightarrow x = \frac{r}{r+1}$

#### 50 DOUBLE ACCURACY - measurement with noise

- $D = A - B + d \quad S = A + B + s \quad A = \frac{1}{2}(D+S) - \frac{1}{2}(d+s)$  etc
- average of  $\frac{1}{2}(d+s)$  , variance of  $\frac{1}{2}(d+s) = \frac{1}{4}(\sigma_d^2 + \sigma_s^2) = \frac{1}{2}\sigma^2$

#### 51 Probability that $X^2 + 2bX + c$ has real roots with b,c uniform over whole area

- here the  $b^2 - 4ac$  is  $4(b^2 - c)$  so need  $b^2 - c > 0$  so  $b^2 > c$   
so choose b so that  $b^2 > c$   
so choose b so that  $b$  outside of  $b^2 = c$
- restrict b to  $[-B \dots B]$  and find area outside  $b^2 = c$

- then let  $B \rightarrow \infty$  • area inside  $b = \sqrt{c}$  integrate  $\int b = \int \sqrt{c} = \frac{x^{\frac{3}{2}}}{\frac{3}{2}}$  with the +/- =

$$2\frac{2}{3}x^{\frac{3}{2}} = \frac{4}{3}x^{\frac{3}{2}} = \frac{4}{3}B^{\frac{3}{2}}$$

- whole area  $4B^2$  so divide to get  $\frac{1}{3\sqrt{B}}$

• NOTE : NOT SAME problem as  $aX^2 + 2bX + c$  with a.b.c uniform because need divide by a and ratio of 2 uniforms not uniform !!

#### 52 2D random walk

- in 2n moves , just need n moves up ( $\leftarrow$  and consequently n moves down) to return to origin, and this in both X and Y dimension • so in 2n moves,  $P(X=0) = \binom{2n}{n} \frac{1}{2}^n \frac{1}{2}^n = \binom{2n}{n} \left(\frac{1}{2}\right)^{2n}$

- so in 2n x 2n moves,  $P(\text{return at } 0) = P(X=0)P(Y=0) = \left[\binom{2n}{n} \left(\frac{1}{2}\right)^{2n}\right]^2$

- sterling approximation  $n! = \sqrt{2\pi n} n^{n+1/2} e^{-n}$  so in 2n x 2n moves,  $P(\text{return at } 0) = \frac{1}{\pi n} \leftarrow$  straight calc
- so number of returns at origin =  $P(\text{return after } 2) \times (\text{counts for } 1 \text{ return}) + P(\text{return after } 4) \times (\text{counts for } 1 \text{ return}) + \dots (\leftarrow \text{ for ever}) = \frac{1}{\pi} \sum \frac{1}{n} = \infty$
- so  $Q=0, P=1$  since  $Q$  = prob of termination in mean =  $\mu = \sum xP^xQ$  and we know form 1D case  $\mu = 1/Q$

#### 53 3D random walk

- same principle  $P(X=0)P(Y=0) = \left[\binom{2n}{n} \left(\frac{1}{2}\right)^{2n}\right]^3$

- same thing in 2n x 2n x2n moves,  $P(\text{return at } 0) = \frac{1}{(\pi n)^{3/2}} \leftarrow$  straight calc  $\leftarrow$  sum of this converges

- so this sum = mean number of returns =  $\sum \frac{1}{(\pi n)^{3/2}} = \mu$

• same as above with terminating sequence mean =  $\mu = \sum xP^xQ$  • num of successes + 1 failure =  $1/Q \rightarrow Q = 1/(\text{num success} + 1) (\leftarrow \text{always } < 1 !!)$  and  $P = 1 - Q$

#### 54 Buffon SHORT needle of lengh 2l tossed over vertical lines 2a apart

- compute distance of centre of needle to nearest parallel given angle with parallel
- $l \cos \theta$  , assume  $\theta$  uniform over  $0.. \frac{\pi}{2}$
- so average distance is  $\frac{l \cos \theta}{a}$  with  $\theta$  uniform over  $0.. \frac{\pi}{2}$
- so  $\int_0^{\frac{\pi}{2}} \left( \frac{1}{\frac{\pi}{2}} \frac{l \cos \theta}{a} d\theta \right) = \frac{2l}{\pi a} \int_0^{\frac{\pi}{2}} \cos \theta d\theta = \frac{2l}{\pi a} [\sin \theta]_0^{\frac{\pi}{2}} = \frac{2l}{\pi a}$

#### 55 Buffon SHORT needle of lengh 2l tossed over vertical and horizontal lines 2a apart

#### 56 Buffon LONG needle of lengh 2l tossed over vertical lines 2a apart