

Probability and Statistics: Lecture-7

Monsoon-2020

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Shrewd Prisoner Problem

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Question: How should the prisoner put the balls such that the probability of his release is maximized?

» Solution to Shrewd Prisoner Problem

- * How did the prisoner arrange to make his chance of success as great as possible?

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- * Put 1 white and 0 black in urn-1, and put 49 white and 100 black in urn-2
- * The **probability of success** is $\frac{1}{2} \times 1 + \frac{1}{2} \times \frac{49}{99} \approx 3/4$

» Extension of the problem

Quiz-1

What is the chance of success of the prisoner if he had been allowed to distribute 100 balls among 4 urns?



» Extension of the problem

Quiz-1

What is the chance of success of the prisoner if he had been allowed to distribute 100 balls among 4 urns?

Quiz-2

What if the number of balls is increased?



» A related Problem in Game Theory: Prisoner's dilemma



» A related Problem in Game Theory: Prisoner's dilemma



- * If both of them do not confess, they serve 2 years each

» A related Problem in Game Theory: Prisoner's dilemma



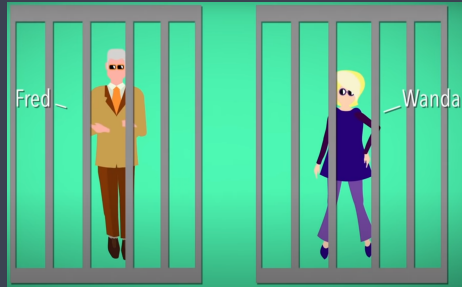
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- * Given that Wanda and Fred have no reason to trust, what is the good option?

Wanda 	Fred 	DON'T CONFESS 	 CONFESS
DON'T CONFESS 		2/2	10/0
 CONFESS		0/10	5/5

Wanda	Fred		
			
		2/2	10/0
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* Indeed, if both don't confess,

Wanda \ Fred	Wanda	Fred	
			
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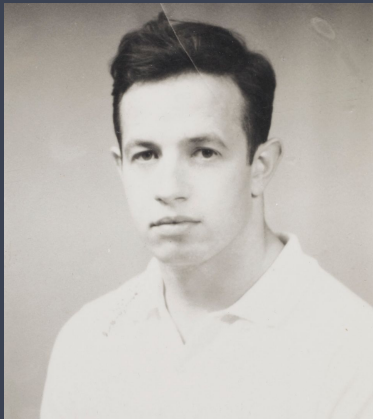
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- * But another best option is when they both confess. Because in other cases, one of them has to spend 10 years in jail

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- * Indeed, if both don't confess, then it is **best** for them; 2 years each!
- * But another best option is when they both confess. Because in other cases, one of them has to spend 10 years in jail
- * This is part of **co-operative games**, and 5/5 is called **Nash equilibrium**
- * These topics are part of topic known as **game theory** (John Nash!)

» About John Nash

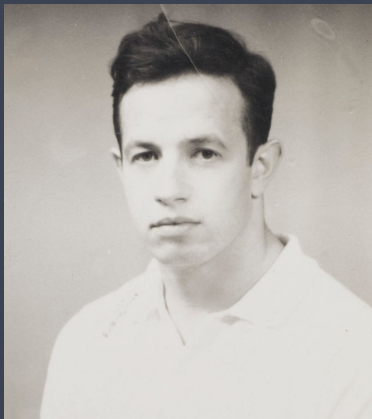


» About John Nash



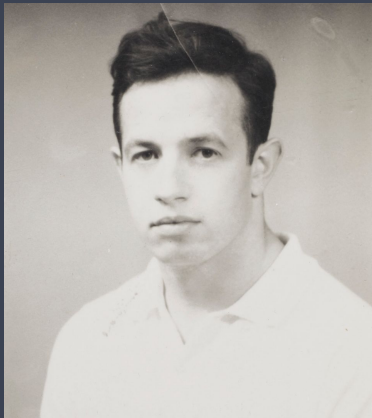
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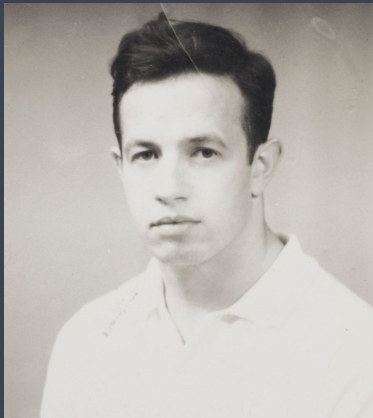
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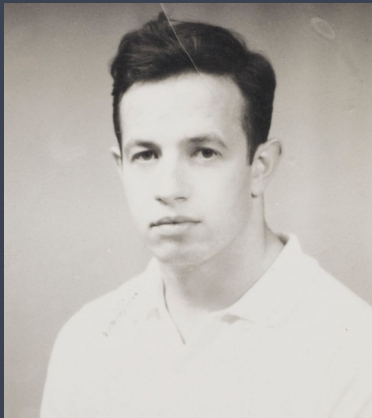
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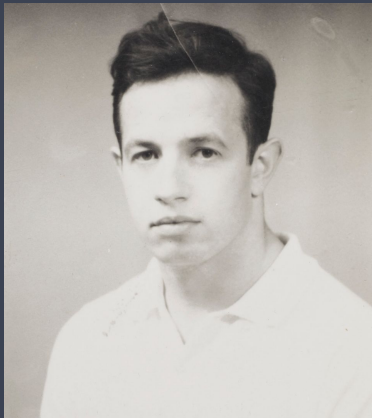
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More on this in Topics in Applied Optimization Elective!

» Watch Bar Scene in “A Beautiful Mind” Movie

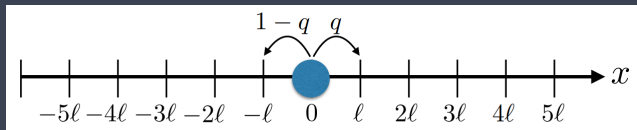
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Movie of Bar Scene Here!

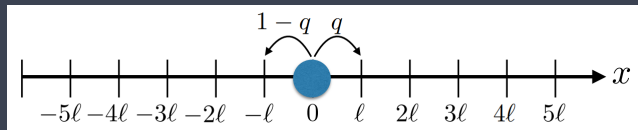
Movie of 1st Brownian Motion

Movie of 2nd Brownian Motion

» Random Walk, Probability

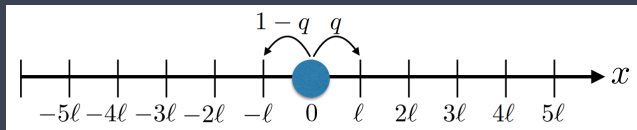


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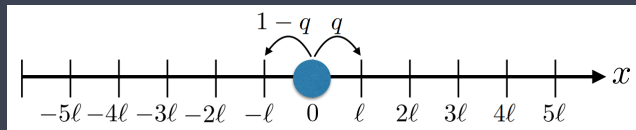
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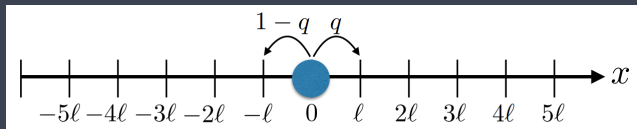
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- * Consider a person at $x = 0$, he can travel one step to the right or to the left
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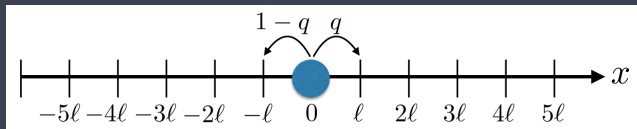


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Simple Random Walk in 1D

A walk is called **simple random walk** in 1D if there is a **equal** probability of either going to right or going to the left. Above, we set $p = q = 1/2$

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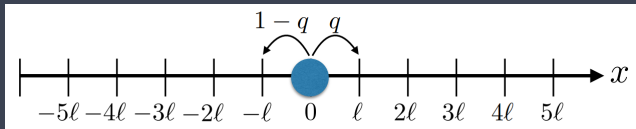
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Question

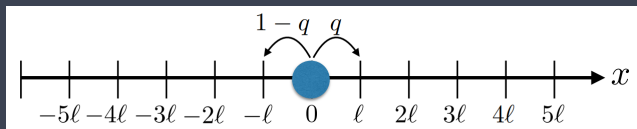
What is the probability that the person after i th step is at $x = 0$?

» Analysis of Simple Random Walk in 1D

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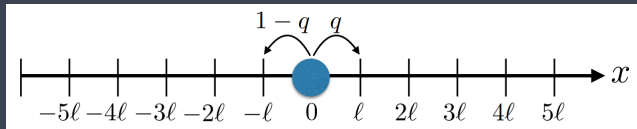


Draw the choice tree (Hint: Galton Board!):

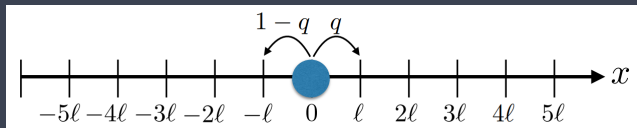


» Analysis of Biased Random Walk in 1D, Binomial Distribution

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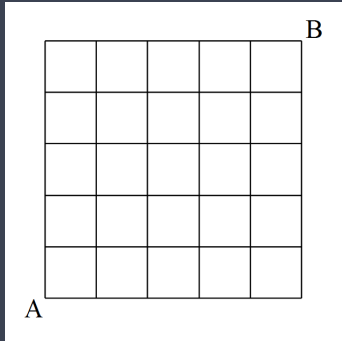
» Analysis of Biased Random Walk in 1D, Binomial Distribution



Draw the choice tree for **unbiased random walk**, derive **binomial distribution**:

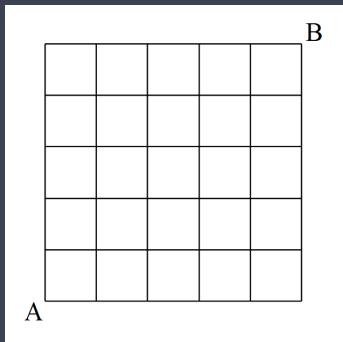


» Random Walkers on 2D Grid...



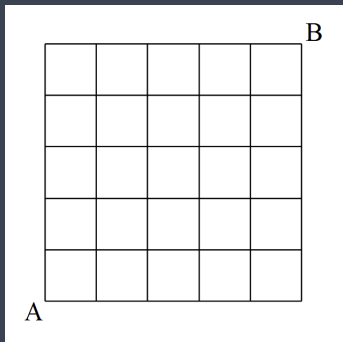
- * Alice starts at point A, and each second, walks one edge right or up (if a point has two options, each direction has a 50

» Random Walkers on 2D Grid...



- * Alice starts at point A, and each second, walks one edge right or up (if a point has two options, each direction has a 50
- * At the same time, Bob starts at point B, and each second he walks one edge left or down (if a point has two options, each direction has a 50

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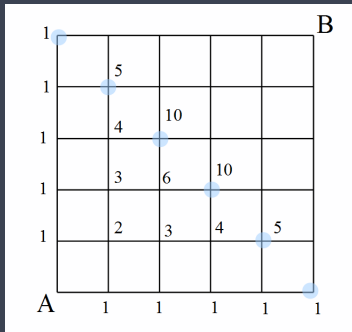


- * Alice starts at point A, and each second, walks one edge right or up (if a point has two options, each direction has a 50)
- * At the same time, Bob starts at point B, and each second he walks one edge left or down (if a point has two options, each direction has a 50)
- * What is the probability Alice and Bob meet during their random walks?

» Solution: Random Walkers on 2D Grid...

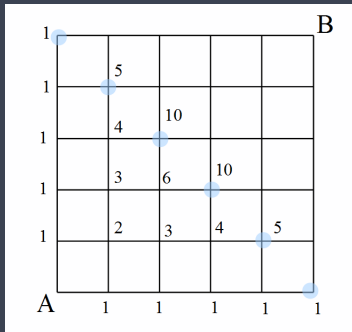
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- * If Alice and Bob meet, they can meet only at the blue circles, which is after both have taken 5 steps

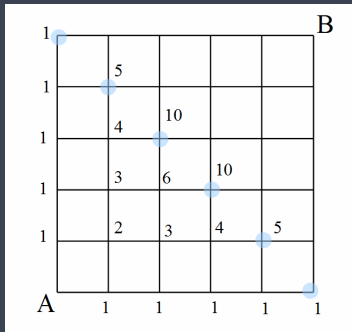


» Solution: Random Walkers on 2D Grid...

- * If Alice and Bob meet, they can meet only at the blue circles, which is after both have taken 5 steps
- * Number of ways they could have taken the 5 steps is 2^5 each, so combined, by product rule they can take $2^5 2^5 = 4^5 = 1024$ total paths!

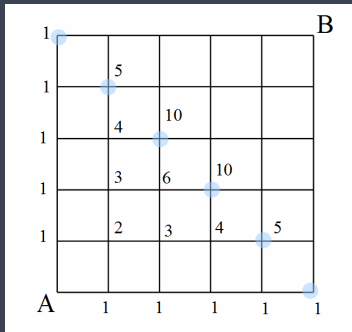


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- * The number of ways Bob can reach the blue dots is given by binomial coefficients or Pascal's triangle! Same for Alice

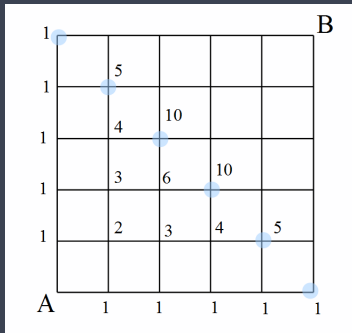
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 - * Total ways Bob and Alice could meet at blue dots is square of binomial coefficients
- * Hence, the total number of ways Bob and Alice could meet

$$1^2 + 5^2 + 10^2 + 5^2 + 1^2 = 252$$

- * The probability that they meet is

$$252/1024 = 24.6\%$$

» Conditional Probability...

- * **Experiment:** Throw two dice A and B simultaneously
 - * **Event:** Odd number on first die
 - * **Question:** What is the probability of the event E ?
-
- * **Event:** Odd number on first die A , and die B always shows even
 - * **Question:** What is the probability of the event E ?