

# Expectation Variance



# Markov Inequality

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$Y$  random variable,  $Y(s) \geq 0$ , then

$$P(Y \geq x) \leq E(Y)/x$$



Andrei Andreyevich Markov  
1856 - 1922

# Chebyshev Inequality

$Y$  random variable, then  $P(|Y - E(Y)| \geq x) \leq V(Y)/x^2$



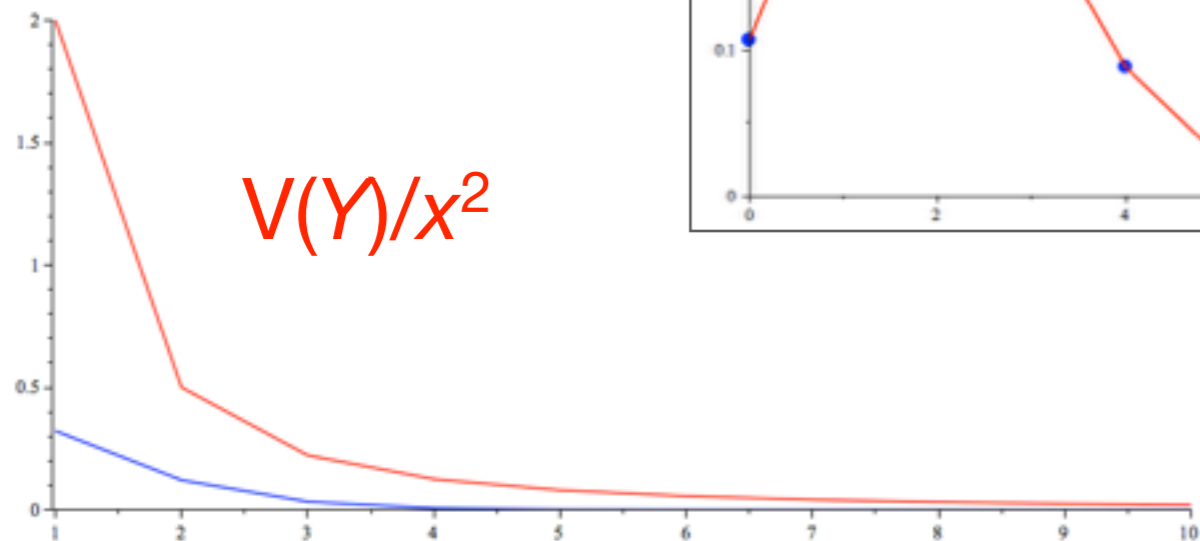
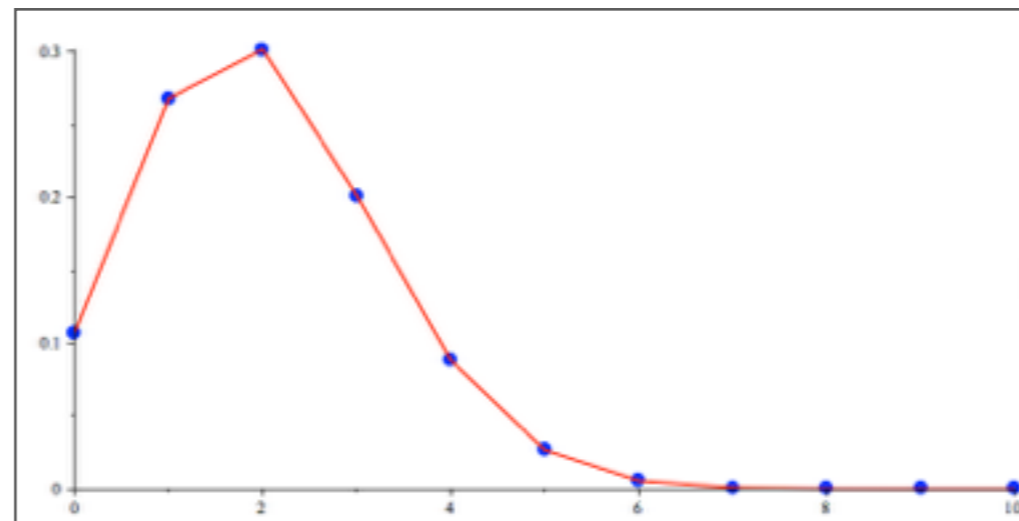
Pafnuty Lvovich Chebyshev  
1821 - 1894

# Quality of Chebyshev Inequality for Binomial Distribution

$Y = B(n,p)$        $n$  independent Bernoulli trials with probability  $p$

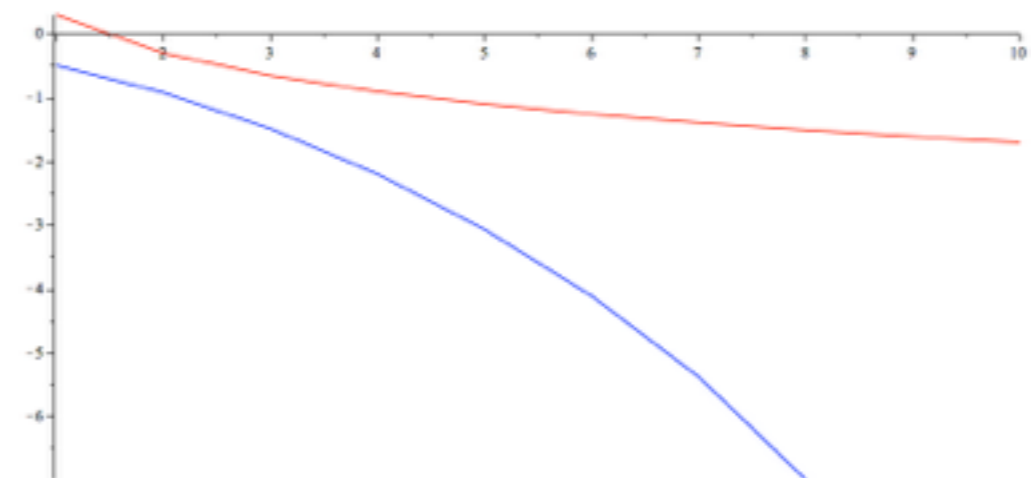
$n = 10, p = 0.2$

$V(Y) = n \cdot p \cdot (1-p) = 1.6$



$P(|Y-E(Y)| \geq x)$

Logarithmic plot

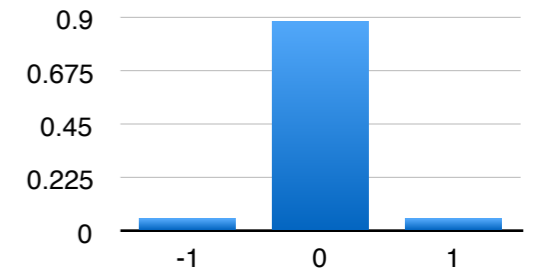
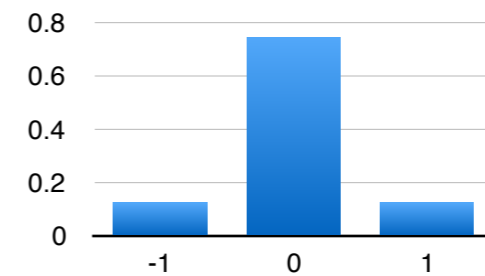
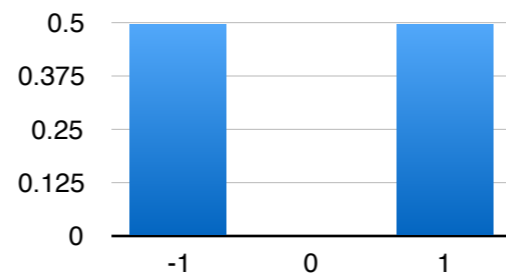


# Can Chebyshev's Inequality be Improved?

- It is best possible for some distributions
- Without further knowledge of the probability distribution, it cannot be improved.

- $X$  probability distribution on the set  $\{-1,0,1\}$  given by

- $P(X=-1) = 1/(2*k^2)$
- $P(X=0) = 1-1/k^2$
- $P(X=1) = 1/(2*k^2)$



- $E(X) = (-1)*1/(2*k^2) + 0*(1-1/k^2)+1*1/(2*k^2) = 0$
- $V(X) = (-1)^2*1/(2*k^2) + 0^2*(1-1/k^2)+1^2*1/(2*k^2) = 1/k^2$
- $P(|X| \geq 1) = P(X=1) + P(X=-1) = 1/k^2 = V(X)/1^2$

# The Monty Hall Problem



# Problem Statement

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- You have three doors.

# Problem Statement

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- You have three doors.

A



B



C





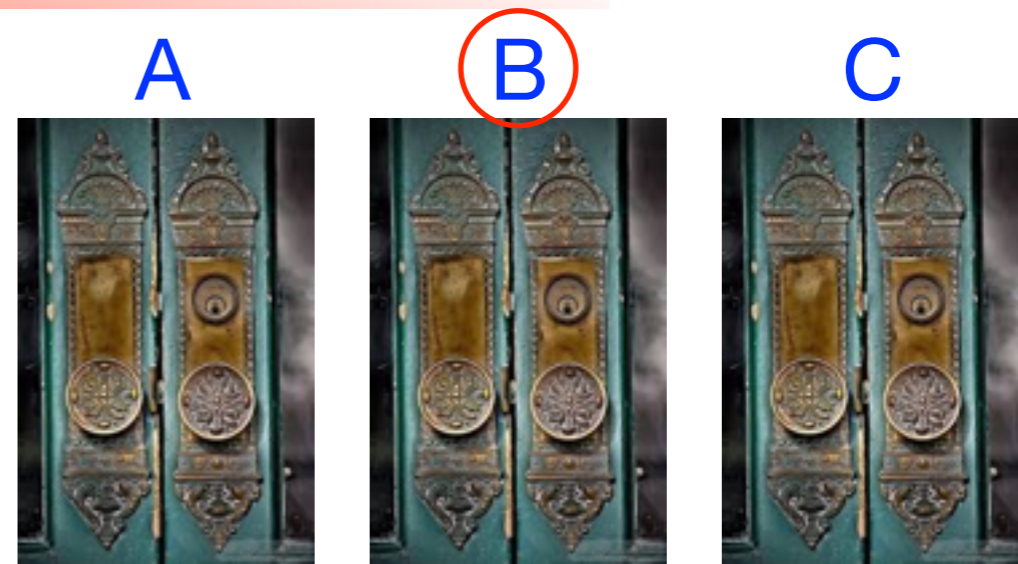
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- You have three doors.
- There is a prize behind one door, and nothing behind the other two



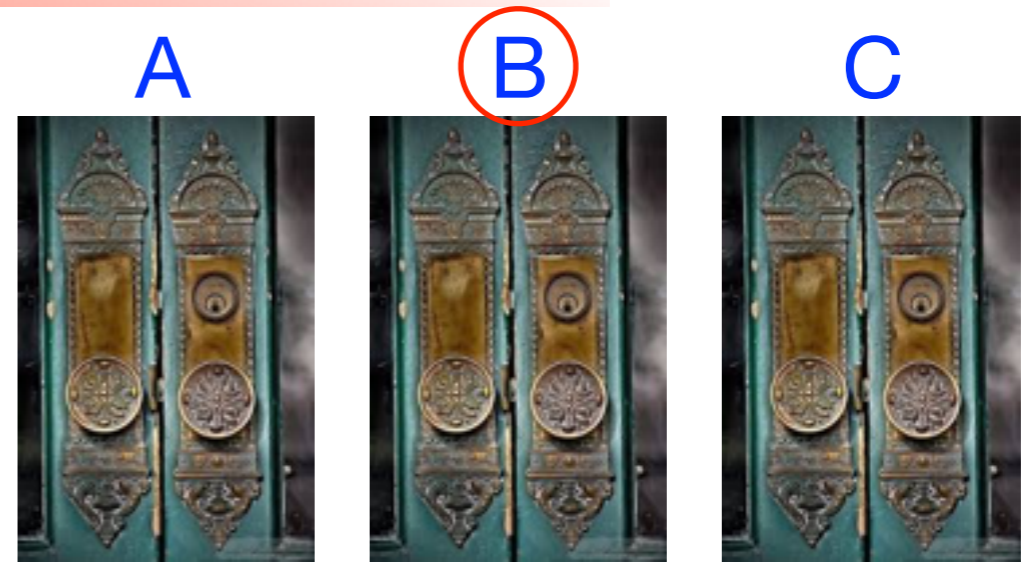
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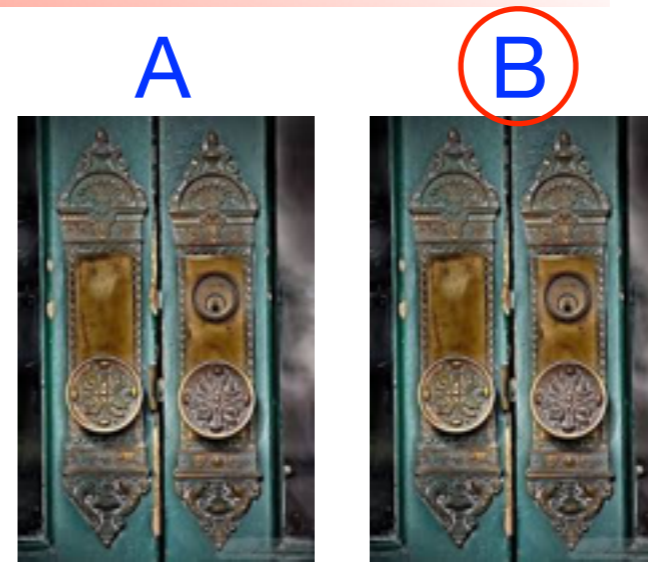
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  - He knows where the prize is



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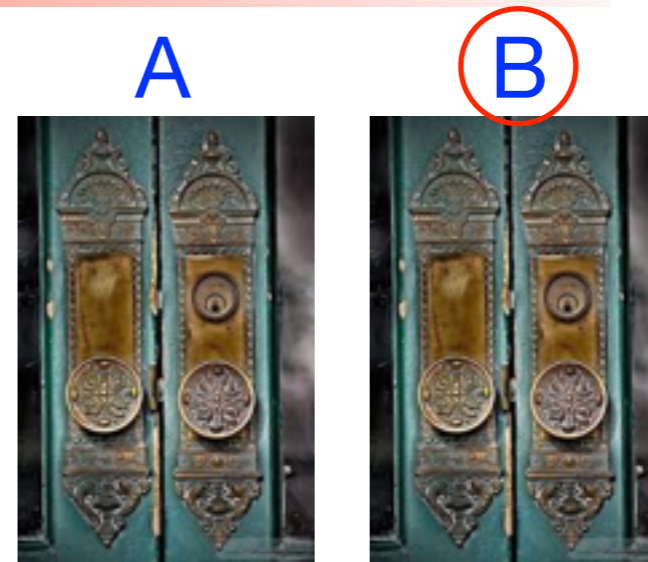


C

Better luck  
next time

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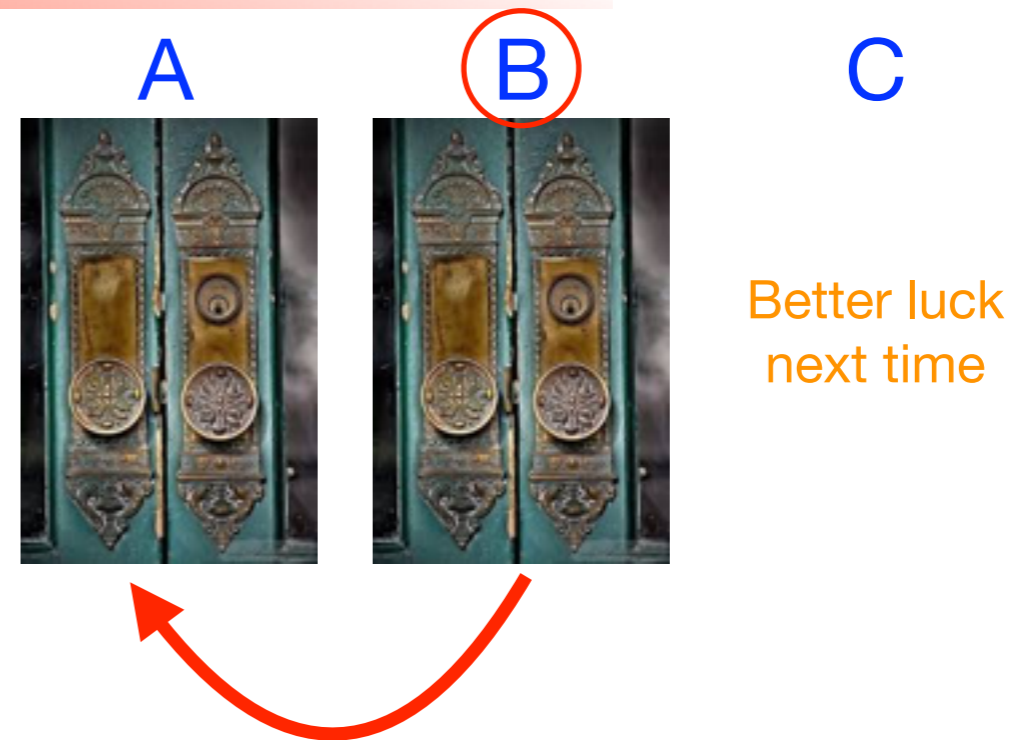
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- The contestant is given the option of switching



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- A contestant is asked to pick one door
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Is there any advantage?

# Is there an Advantage? “Obviously Not!”

- Once Monty Hall opens one of the doors, the prize is behind one of the other two
- The position of the prize was randomly selected to begin with
- The probability of having the prize behind any of the remaining doors is 50%
- So, whether you switch or stay with your choice, you have 50% chance of winning



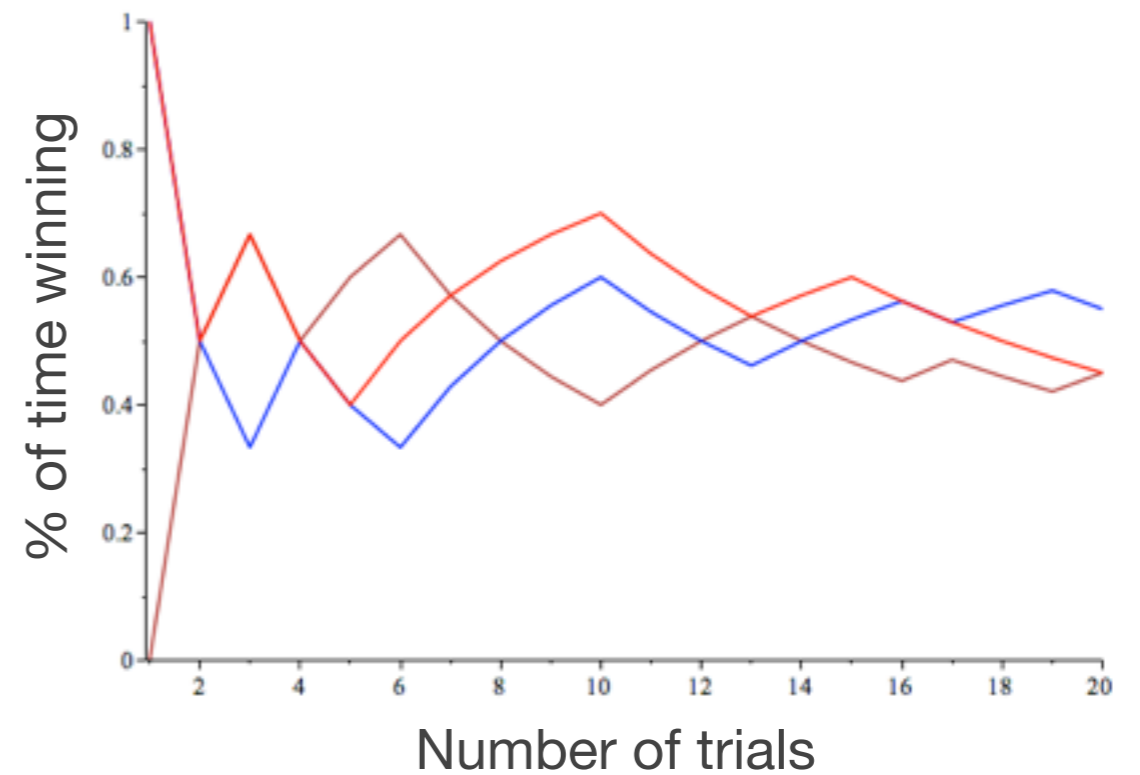
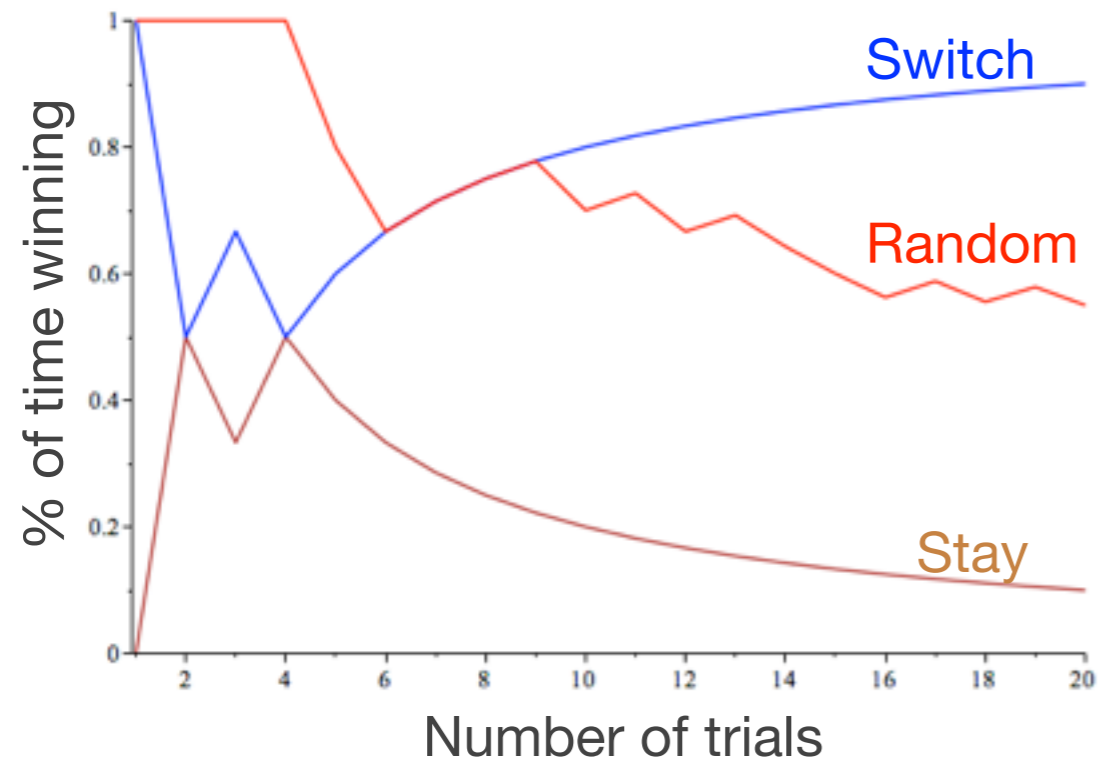
# Well Then, Let's Play the Game!

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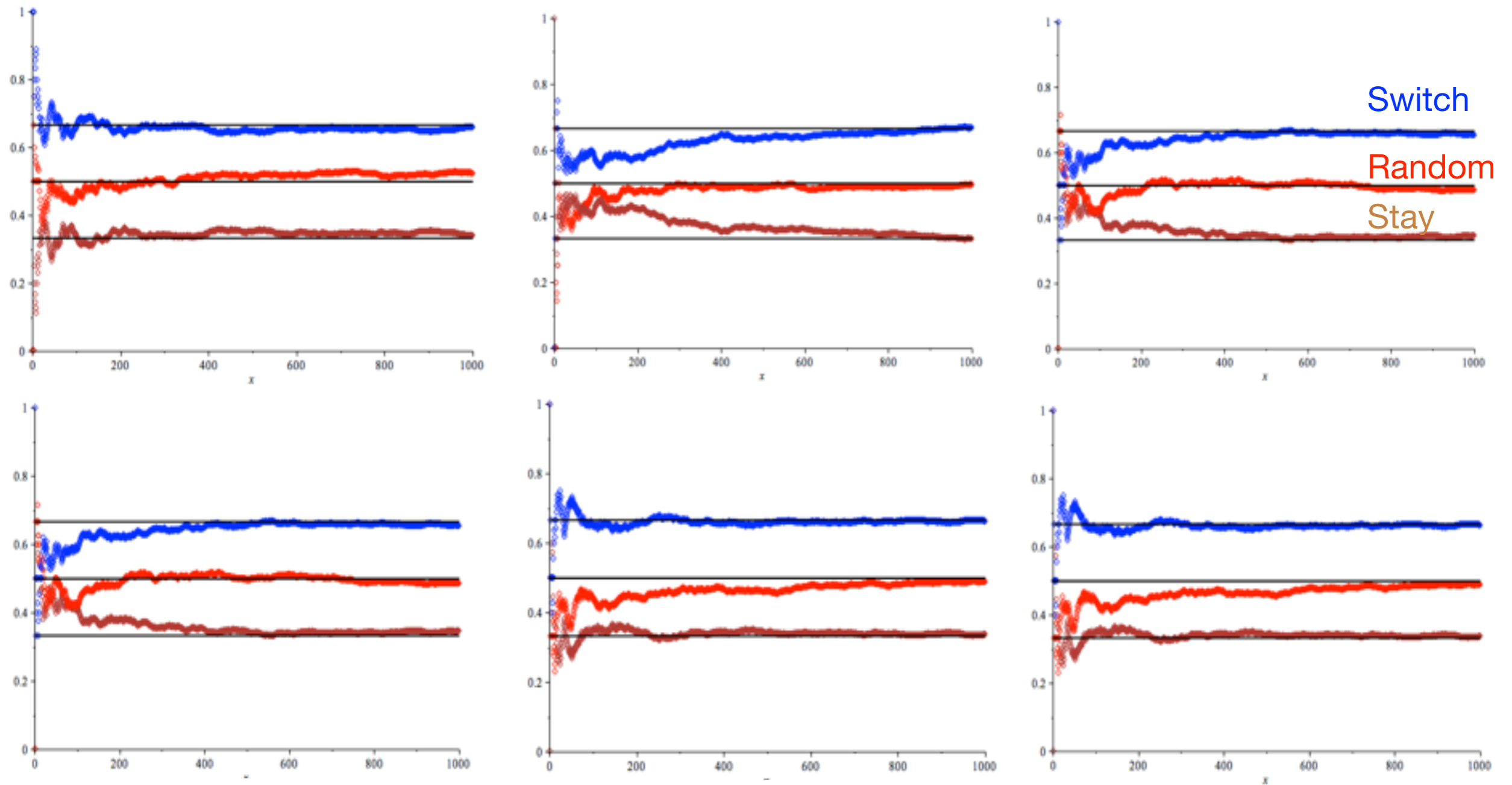
- We play it 20 times
- One person chooses the door behind which the prize is (and keeps it to herself)
- One person always **switches**
- One person always **stays** with original choice
- One person switches **randomly** (per coin flip)
- We record the number of times each person wins (sometimes two persons may win)



# Here are Computer Simulations of 20 Games



# Here are Computer Simulations of 1000 Games



Switching seems to win with probability  $2/3$

Random seems to win with probability  $1/2$

Staying seems to win with probability  $1/3$

# Marilyn Vos Savant

- Ran a Sunday column in the “Parade” magazine called “Ask Marilyn”
  - Solved puzzles, answered questions on various subjects
- Was asked about the Monty Hall Problem (1990)
  - Answered “If you switch, you win with probability  $2/3$ ”
- This created a storm of controversy in the US
  - Received 10000 letters objecting to her solution
  - Among them 1000 PhD’s in Math and Physics
- But... She was right!



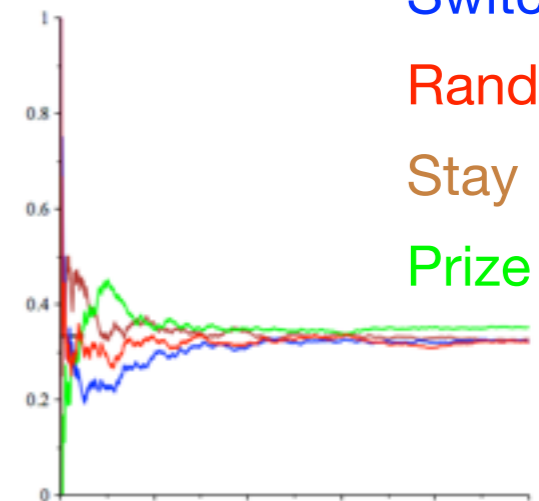
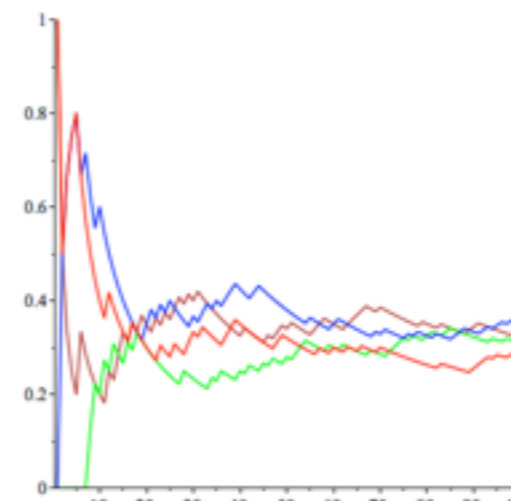
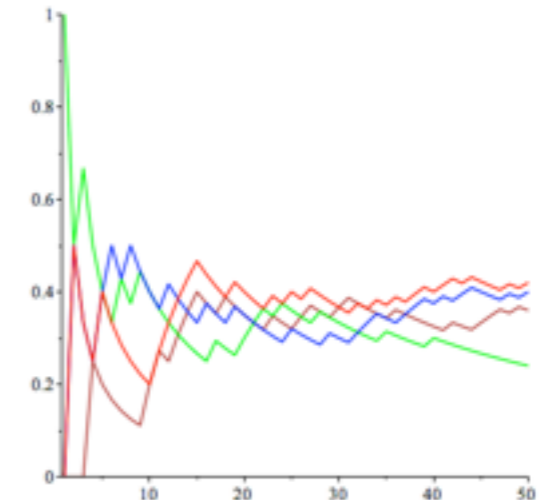
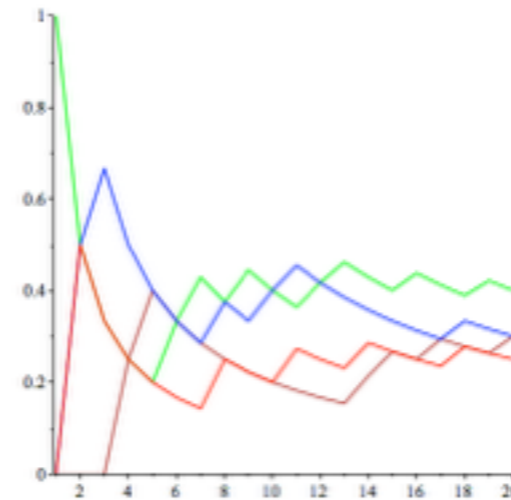
# Why?

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- Extremely important:
  - The host always opens a remaining door behind which there is no prize (because he knows where the prize is)
- Therefore, if you switch, the only way of losing is if the prize was behind the original door
  - The probability of that is  $1/3$
  - So, you win with probability  $2/3$  if you switch and you win with probability  $1/3$  if you stay
- If you randomly switch, then you switch between the probabilities  $1/3$  and  $2/3$  with equal chance, so you win with probability  $(1/3+2/3)/2 = 1/2$ .

# What if the Host doesn't Know where the Prize is?

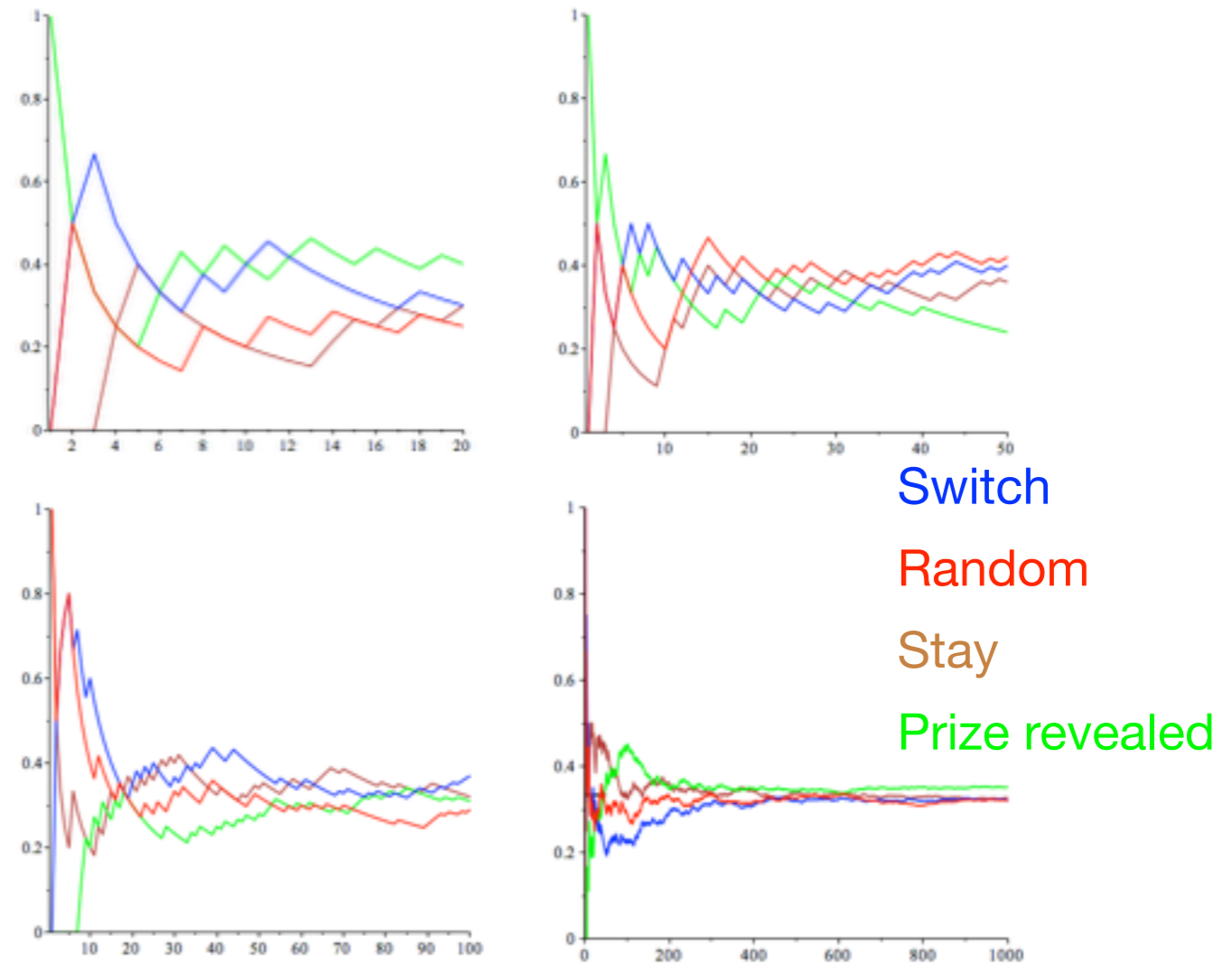
- Host randomly opens one of the other two doors
- If there is a prize behind that, the game is finished — no winner
- If there is no prize, the contestant can
  - Switch
  - Stay
  - Randomly select among the other two doors
- Is there an advantage?



Switch  
Random  
Stay  
Prize revealed

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No advantage in this case