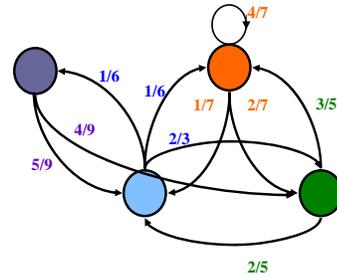




# Random Walks



## Graph with probable transitions



## Graph with probable transitions

### Questions

- $\Pr\{\text{blue reaches orange before green}\}$  □
- $\Pr\{\text{blue ever reaches orange}\}$
- $E[\#\text{steps blue to orange}]$
- Average fraction of time at blue



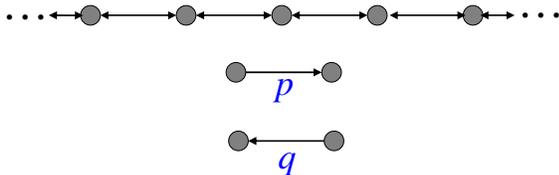
## Random Walks

### Applications

- Finance – Stocks, options
- Algorithms – web search, clustering
- Physics – Brownian Motion



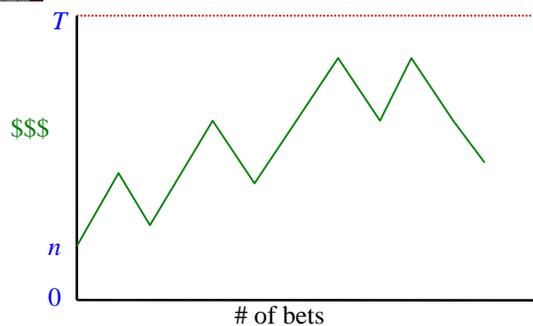
## 1-Dimensional Walk



## Gambler's Ruin



## Gambler's Ruin





## Gambler's Ruin

Parameters:

$n ::=$  initial capital (stake)

$T ::=$  gambler's Target

$p ::=$  Pr{win \$1 bet}

$q ::= 1 - p$

$m ::=$  intended profit =  $T - n$

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## Gambler's Ruin

Three general cases:

- Biased against  $p < 1/2$
- Biased in favor  $p > 1/2$
- Unbiased (Fair)  $p = 1/2$

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## Fair Case: $p = q = 1/2$

Let  $w ::=$  Pr{reach Target}

$$E[\$\$] = w \cdot (T - n) + (1 - w) \cdot (-n)$$

$$= wT - n$$

But game is *fair*, so  $E[\$\$ \text{ won}] = 0$

$$w = \frac{n}{T}$$

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## Fair Case: $p = q = 1/2$

Let  $w ::=$  Pr{reach Target}

$$w = \frac{n}{T}$$

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## Fair Case

Consequences

$n=500, T=600$

$$\Pr\{\text{win } \$100\} = 500/600 \approx 0.83$$

$n=1,000,000, T=1,000,100$

$$\Pr\{\text{win } \$100\} \approx 0.9999$$

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## Biased Against: $p < 1/2 < q$

Betting *red* in US roulette

$$p = 18/38 = 9/19 < 1/2$$

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### Biased Against: $p < 1/2 < q$

Astonishing Fact!

Pr{win \$100 starting with \$500}  
< 1/37,000 !  
(was 5/6 in the unbiased case.)



### Biased Against: $p < 1/2 < q$

*More amazing still!*

Pr{win \$100 starting with \$1M}  
< 1/37,000  
Pr{win \$100 starting w/ any \$n stake}  
< 1/37,000



### Winning in the Unfair Case

Team Problem: for  $p < q$ ,

$$w_n \leq \frac{(q/p)^n}{(q/p)^T} = \left(\frac{p}{q}\right)^m$$

where  $m ::= T-n =$  intended profit



### Winning in the Unfair Case

for  $p < q$ :

$$\left(\frac{p}{q}\right)^m$$

is exponentially decreasing in  $m$ ,  
the intended profit.



### Losing in Roulette

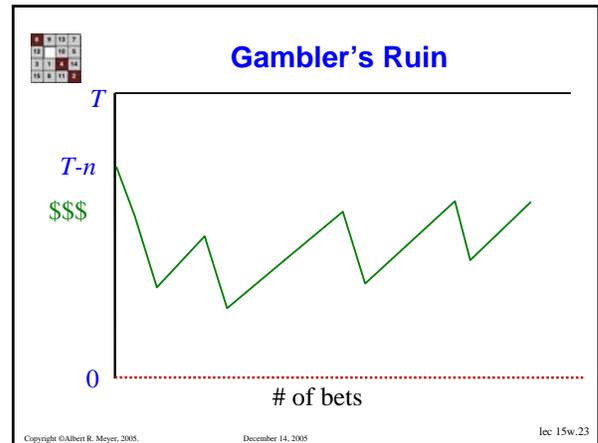
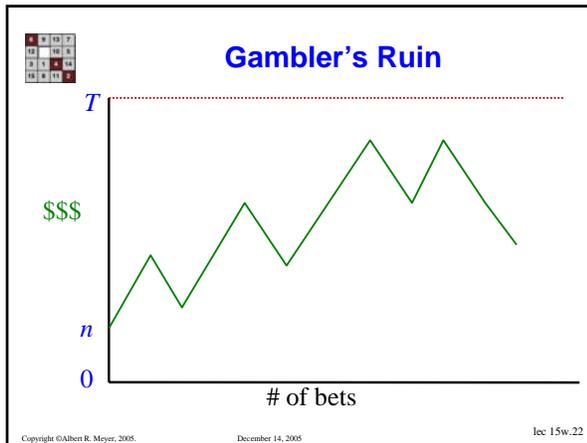
$p = 18/38, q = 20/38$

$$\Pr\{\text{win } \$100\} = \left(\frac{18/38}{20/38}\right)^{100} = \left(\frac{9}{10}\right)^{100} < \frac{1}{37,648}$$



### Losing in Roulette

$$\Pr\{\text{win } \$200\} = (\Pr\{\text{win } \$100\})^2 = \left(\frac{1}{37,648}\right)^2 < \frac{1}{70,000,000}$$



**Fair Case**

$$\begin{aligned} & \text{pr}\{\text{lose starting with } \$n\} \\ &= \text{pr}\{\text{win starting with } \$(T-n)\} \\ &= \frac{T-n}{T} \end{aligned}$$

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**Fair Case for  $T = \infty$**

$$\begin{aligned} & \text{Pr}\{\text{lose starting with } n \mid T = \infty\} \\ & \geq \text{Pr}\{\text{lose starting with } n \mid T < \infty\} \\ & = \frac{T-n}{T} \rightarrow \infty \quad \text{as } T \rightarrow \infty \end{aligned}$$

So if the gambler keeps betting,  
he is sure to go broke.

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**Return to the origin.**

If you start at the origin and move left or right with equal probability, and keep moving in this way,

$$\text{Pr}\{\text{return to origin}\} = 1$$

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**How Many Bets?**

What is the expected number of bets for the game to end?

- either by winning  $\$(T-n)$  or
- by going broke (losing  $\$n$ ).

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## How Many Bets? Fair Case

$E[\# \text{ bets}] = n(T-n) =$   
(initial stake)·(intended profit)  
proof by solving **linear recurrence**:

$$e_n = p(1 + e_{n+1}) + q(1 + e_{n-1})$$

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## Fair Case for $T = \infty$

Likewise,

$$\begin{aligned} E[\# \text{ bets for } T = \infty] &\geq E[\# \text{ bets for } T < \infty] \\ &= n(T-n) \rightarrow \infty \quad (\text{as } T \rightarrow \infty) \end{aligned}$$

So the **expected #bets to go broke** is  
**infinite!**

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## Team Problems

# Problems 1–3

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