



Chance moves

Imperfect information

Bluffing game:

Both players put \$1 (ante) to the pot.

Player I is dealt a card: hidden to player II

Winning card with a probability  $\frac{1}{4}$

Losing card with a probability  $\frac{3}{4}$

Player I:

Check: the card is checked

Winning: 1 (payoff to I)

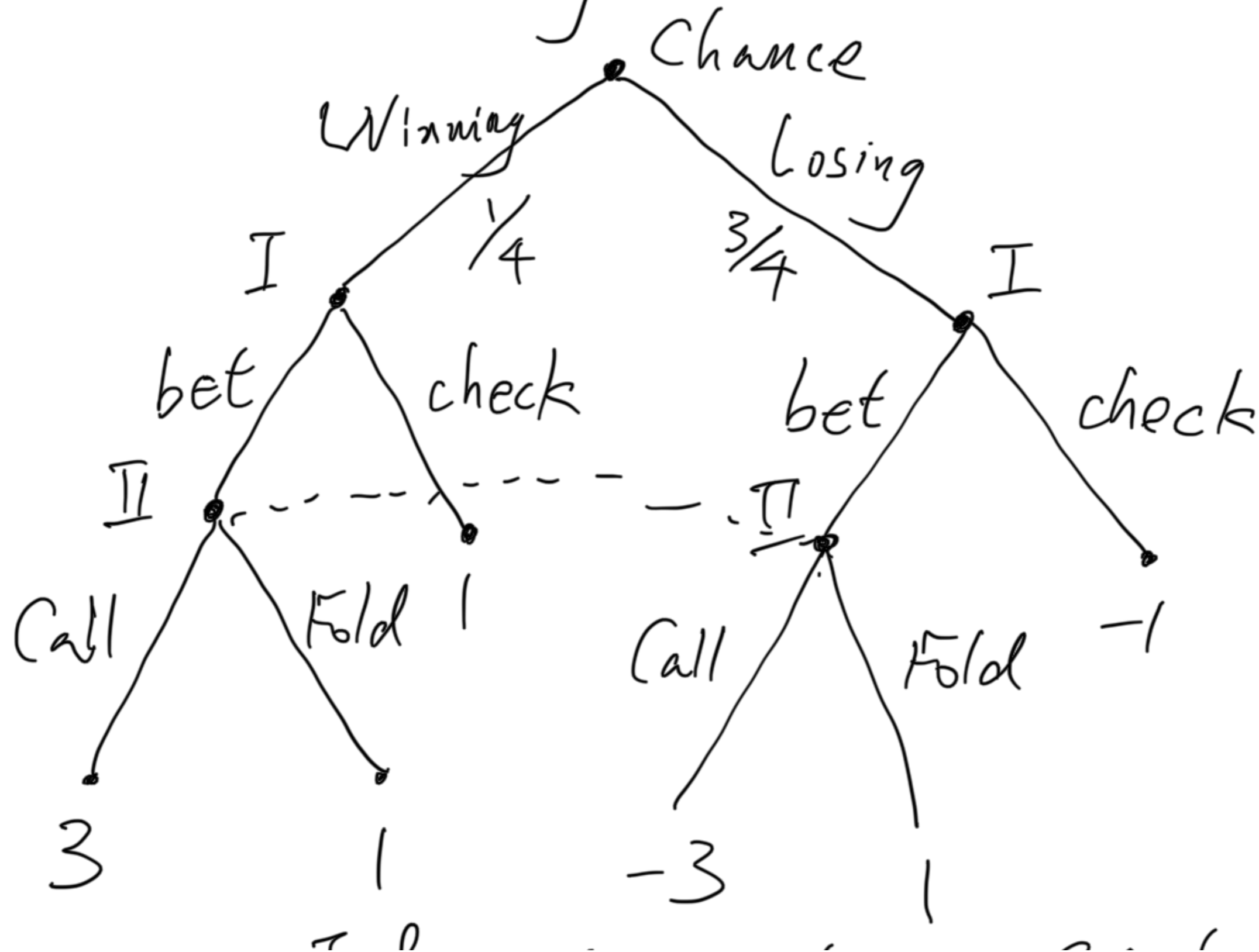
Losing: -1

Bet: Puts \$2 to the pot

Player II :

Fold : 1 (no matter what card I has)

Call : Winning : 3  
Losing : -3



	Information set	Strategies
Player I	Winning, Losing	bb, bc, cb, cc
Player II	Bet	c, f

		Player II
		c
Player I	bb	$\frac{1}{4} \times 3 + \frac{3}{4} \times (-3) = -\frac{3}{2}$
	bc	
	cb	$\frac{1}{4} \times 1 + \frac{3}{4} \times (-3) = -2$
	cc	

f

$\frac{1}{4} \times 1 + \frac{3}{4} \times (-1) = -\frac{1}{2}$

$$\begin{pmatrix} -\frac{3}{2} & -\frac{1}{2} \\ 0 & -\frac{1}{2} \\ -\frac{1}{2} & -\frac{1}{2} \end{pmatrix}$$

*(Note: In the original image, the second and third rows and the second and third columns of this matrix are crossed out with a large 'X'.)*

bb : bluffing strategy

bc : honest strategy

The matrix reduces to

$$\begin{matrix} bb \\ bc \end{matrix} \begin{pmatrix} -\frac{3}{2} & 1 \\ 0 & -\frac{1}{2} \end{pmatrix}$$

Always bet for winning

Bet  $\frac{1}{6}$  for losing

Maximin strategy:  $\vec{p} = (\frac{1}{6}, \frac{5}{6}, 0, 0)$  ←

Minimax strategy:  $\vec{q} = (\frac{1}{2}, \frac{1}{2})$

value:  $v = -\frac{1}{4}$

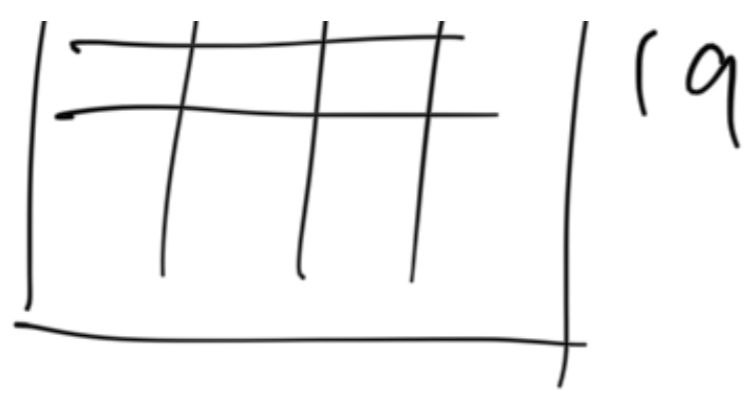
Monte Carlo tree search (MCTS)

AlphaGo vs Lee Sedol 2016 4:1

Deep Blue 1996 Chess game

Minimax Algorithm



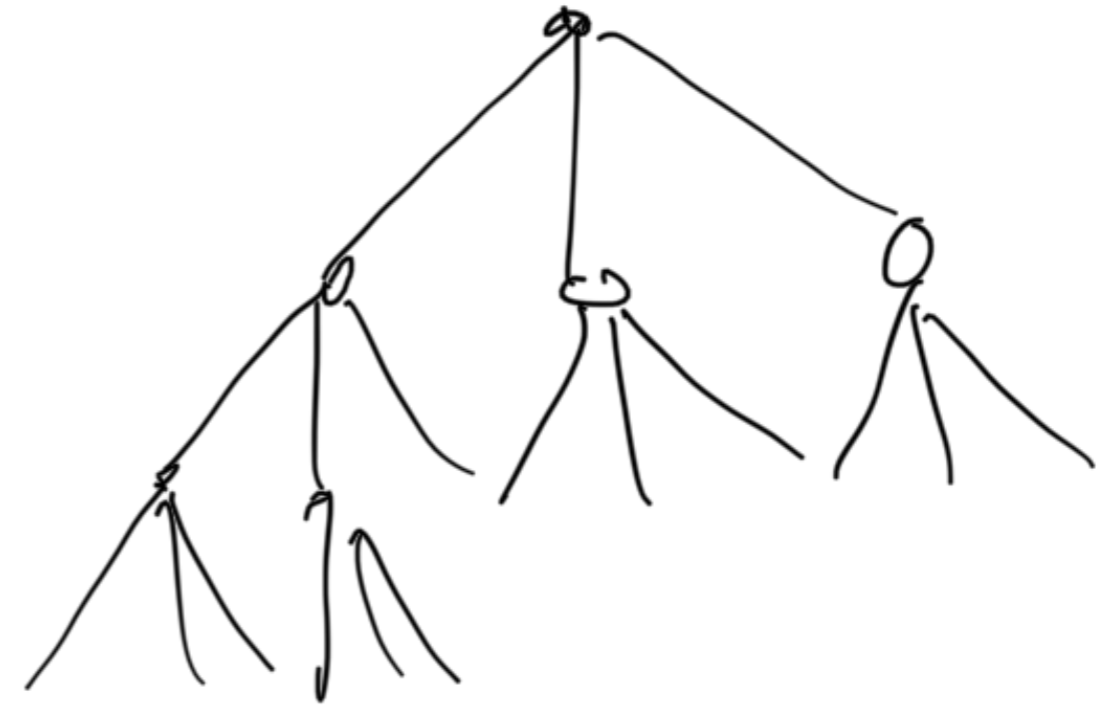


$$17 \times 17 = 381 \text{ squares}$$

$$381! \approx 10^{768}$$

## 4 steps of MCTS

1. Selection
2. Expansion
3. Simulation
4. Backpropagation



Choose the move which have the highest upper confidence bounded UCB

$$\frac{S_c}{n_c} + k \sqrt{\frac{2 \ln n_p}{n_c}}$$

Dollar note game:

\$10 note \$20 note

T...

Terran:

Left pocket	1	1
Right pocket	1	3

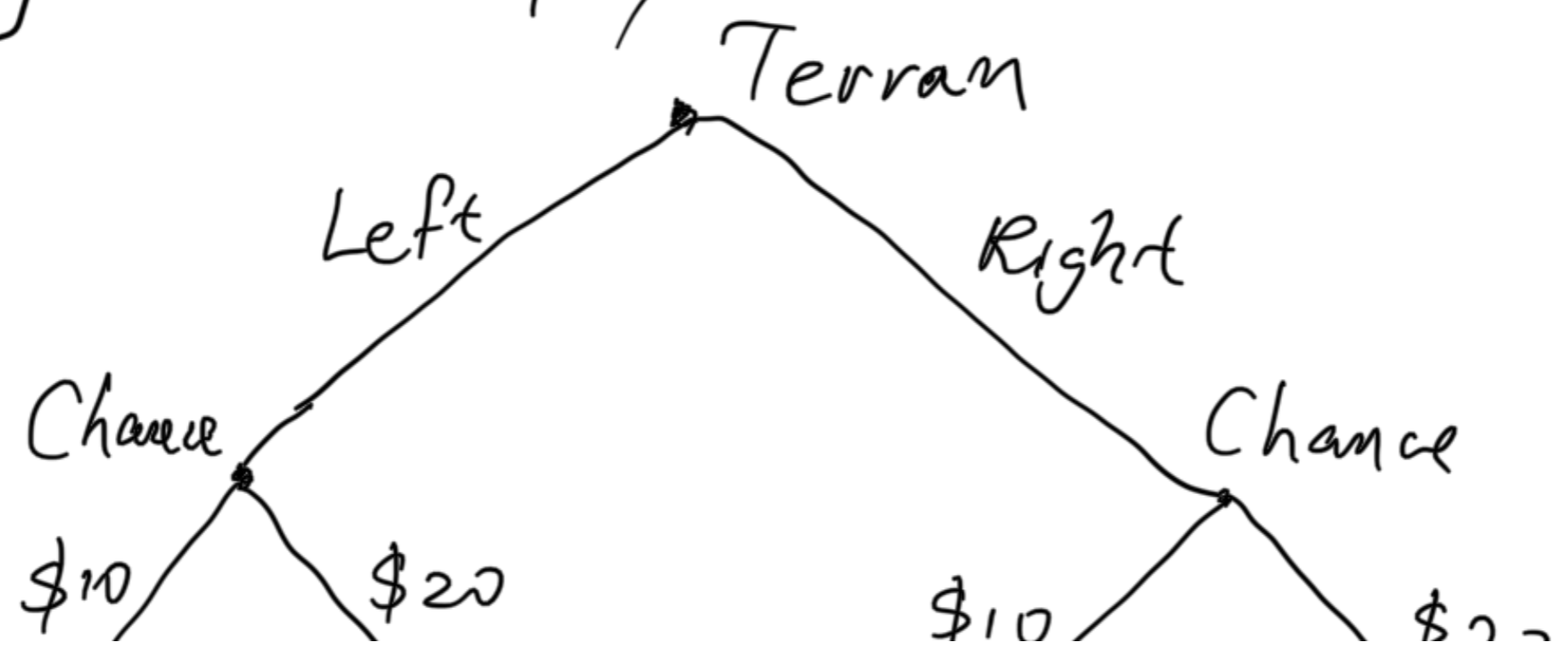
Terran chooses one pocket, pick a role at random and reveal it to Martian

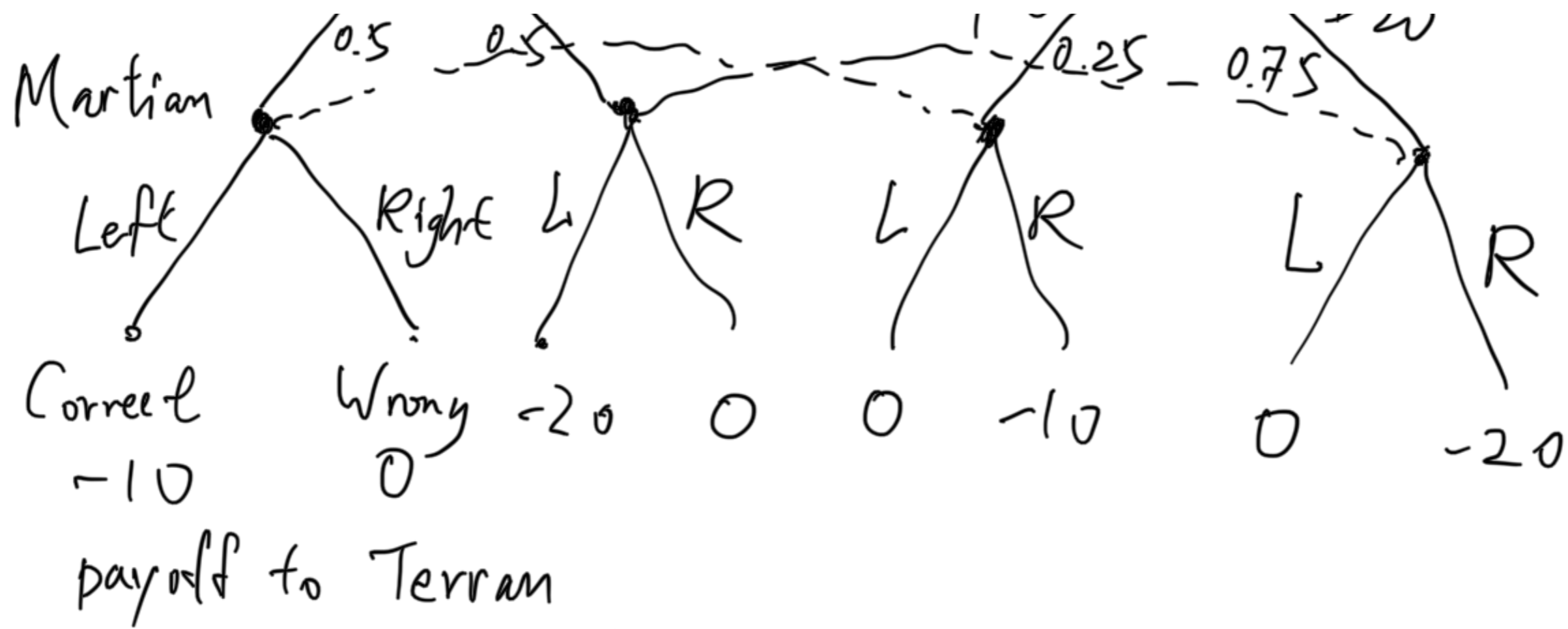
Martian does not know which pocket Terran has chosen but knows the value of the role.

Martian guesses: Left or Right

Correct: Martian gets the role Terran

Wrong: No payoff





Information set

Strategies

Terran

Initial

L, R

Martian

\$10, \$20

LL, LR, RL, RR

LL

LR

RL

RR

L  $0.5(-10) + 0.5(-20) = -15$

$0.5(0) + 0.5(-20) = -10$

R

$0.25(0) + 0.75(-20) = -15$

$$\begin{pmatrix} -15 & -5 & -10 & 0 \\ 0 & -15 & -2.5 & -17.5 \end{pmatrix}$$



$$\begin{pmatrix} -15 & -5 \\ 0 & -15 \end{pmatrix}$$

Maximin strategy:  $\vec{p} = (0.6, 0.4)$

Minimax strategy:  $\vec{q} = (0.4, 0.6, 0, 0)$

value :  $v = -9$

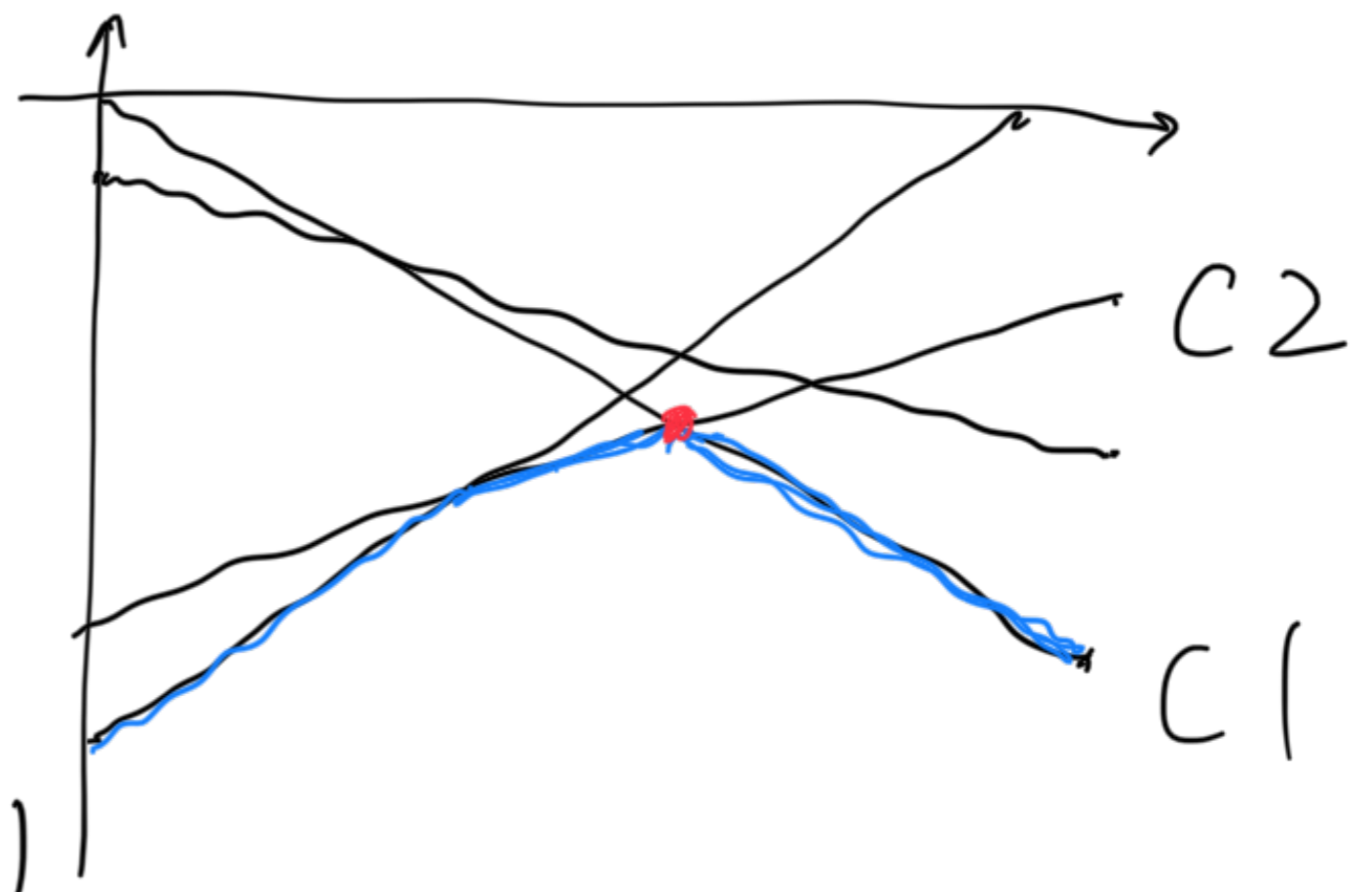
Always Left if \$10

Left, Right with probabilities 0.4, 0.6 if \$20

Recursive games

$$G_1 = \begin{pmatrix} 0 & 3 \\ 2 & -1 \end{pmatrix}, \quad G_2 = \begin{pmatrix} 0 & 1 \\ 4 & 3 \end{pmatrix}$$

2x2 zero sum games



$$G = \begin{pmatrix} G_1 & 4 \\ 5 & G_2 \end{pmatrix}$$

$$v_1 = v(G_1) = 1$$

$$v_2 = v(G_2) = 3$$

$G$  is equivalent to  $\begin{pmatrix} 1 & 4 \\ 5 & 3 \end{pmatrix}$

$$v(G) = 17/5.$$

Inspection game:

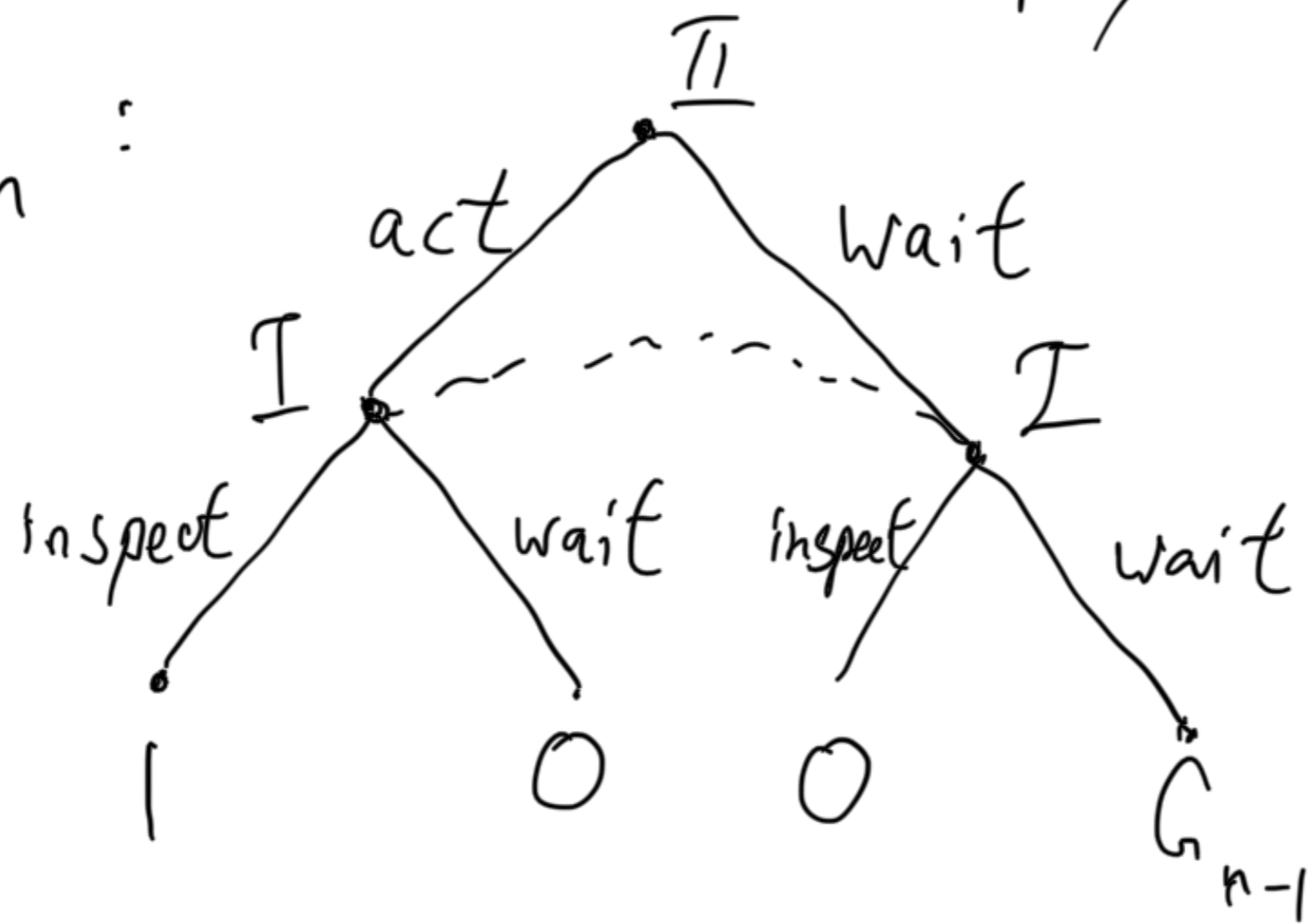
Player II must perform an action in the next  $n$  time periods.

Player I is allowed to inspect once in  $n$  time periods.

Player II is caught by Player I: payoff = 1

Player I missed: No payoff

$G_n$ :



I: inspect, wait

II: act, wait

$$G_n = \begin{pmatrix} 1 & 0 \\ 0 & G_{n-1} \end{pmatrix}$$

$$G_1 = (1) \quad v_1 = v(G_1) = 1$$

Let  $v_n = v(G_n)$

$$\frac{1}{1 + \frac{1}{2}} = \frac{1}{2+1} = \frac{1}{3}$$

$$G_n = \begin{pmatrix} 1 & 0 \\ 0 & V_{n-1} \end{pmatrix}$$

$$V_n = v(G_n) = \frac{1}{\frac{1}{1} + \frac{1}{V_{n-1}}} = \frac{V_{n-1}}{1 + V_{n-1}}$$

n	1	2	3	4
$V_n$	1	$\frac{1}{2}$	$\frac{1}{3}$	$\frac{1}{4}$

In fact  $V_n = \frac{1}{n}$

$$G_n = \begin{pmatrix} 1 & 0 \\ 0 & \frac{1}{n} \end{pmatrix}$$

maximin strategy:  $\vec{p} = \left(\frac{1}{n}, \frac{n-1}{n}\right)$   
 minimax strategy:  $\vec{q} = \left(\frac{1}{n}, \frac{n-1}{n}\right)$