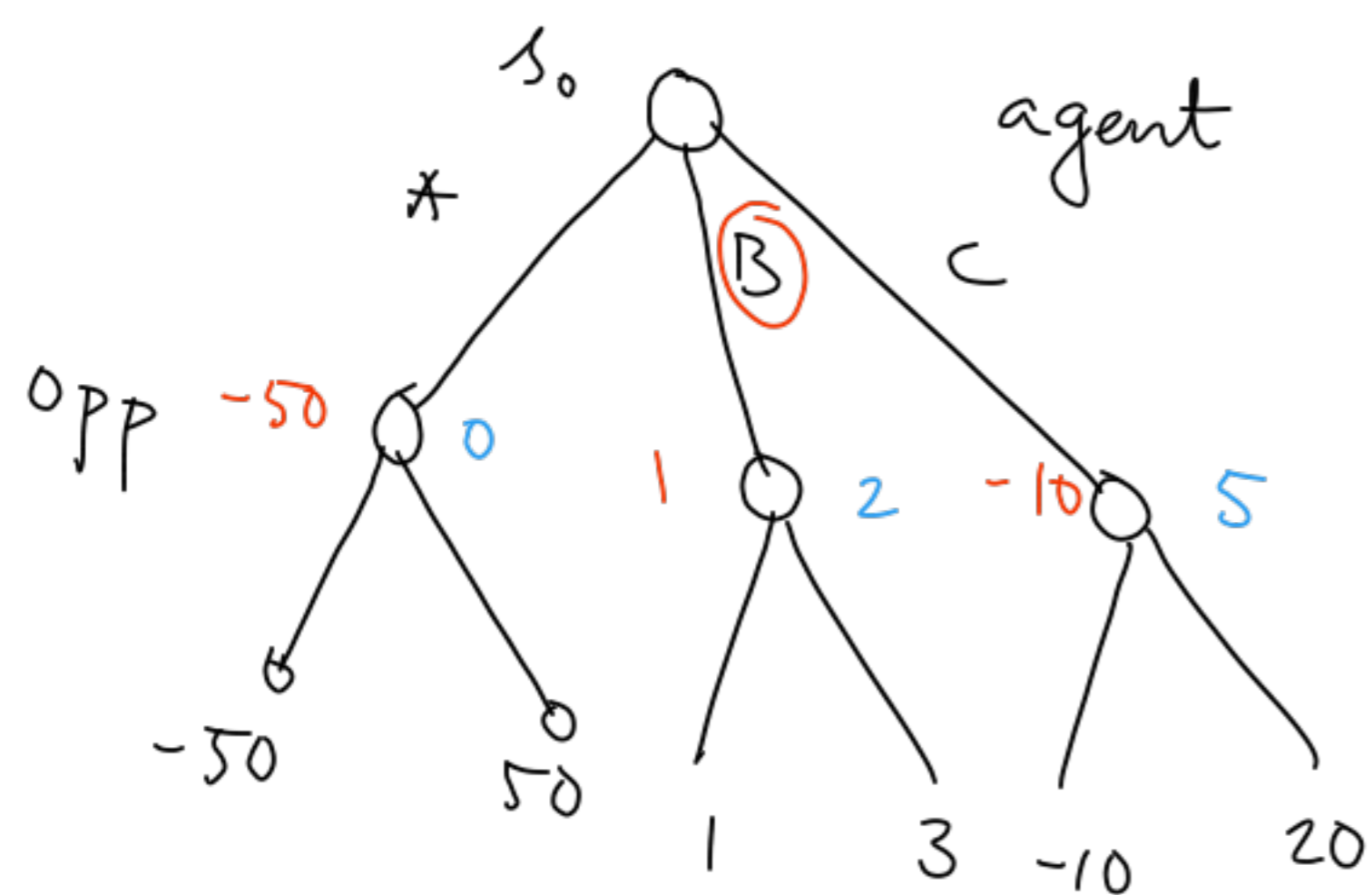


# Lec 19: Two player competitive games



Player 1 picks the bucket (agent)

Player 2 picks a number from the "selected" bucket. (OPP)



OPP: stochastic  $(\frac{1}{2}, \frac{1}{2})$   
min player

Two player zero sum game (sequential move)

Players = {agent, opp}

$s_0$  = starting state

$s$  is intermediate state

- actions( $s$ ) = possible actions at state  $s$
- Player( $s$ ) = The player who makes the move at  $s$
- Succ( $s, a$ ) = resulting state if action  $a$  is taken at state  $s$

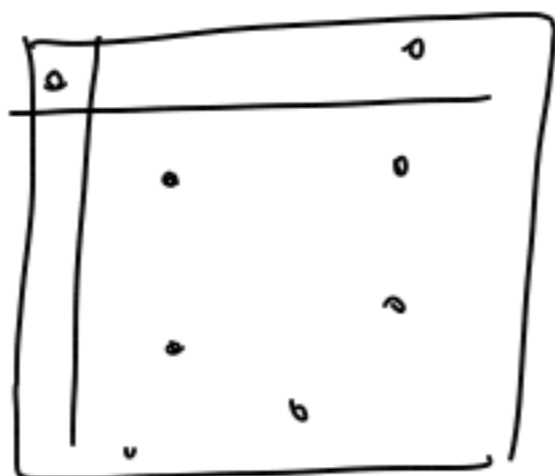
isEnd( $s$ ) = is state  $s$  an end state

utility( $s$ ) = agent's utility at an end state  $s$ .

E.g. Chess

players = {white, black}

$s$  = a board position



actions( $s$ ) = all legal moves by the player( $s$ )

is End( $s$ ) = whether  $s$  is a checkmate or a draw

utility( $s$ ) =  $+M$  if white wins  
 $-M$  if " loses  
 $0$  if draw

Constant sum game

player = {B, S}

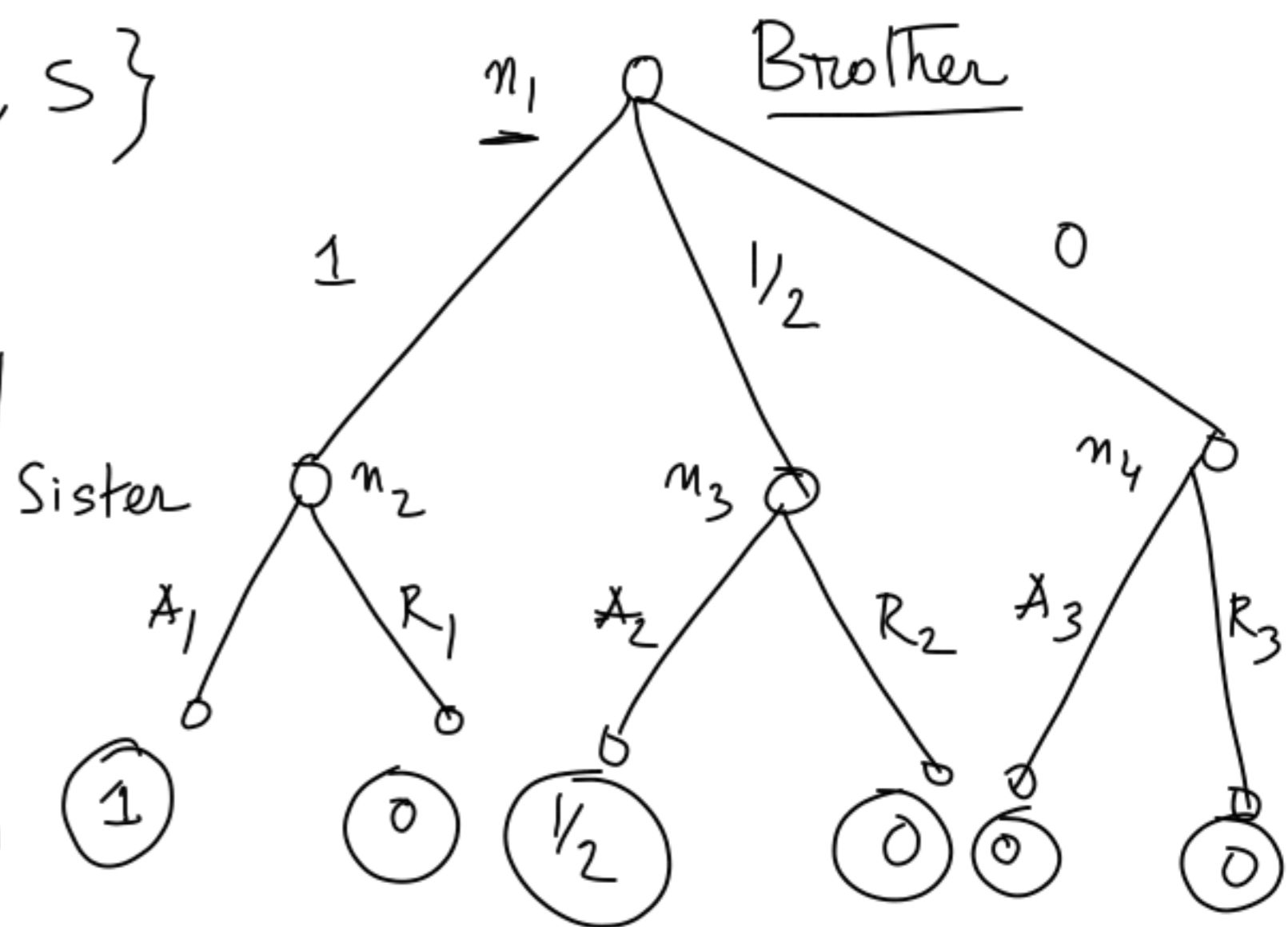
actions( $s$ )

{ $\{1, \frac{1}{2}, 0\}$ ,  $s=n_1$ }

{ $\{A_1, R_1\}$ ,  $s=n_2$ }

{ $\{A_2, R_2\}$ ,  $s=n_3$ }

{ $\{A_3, R_3\}$ ,  $s=n_4$ }



# Strategy of a player

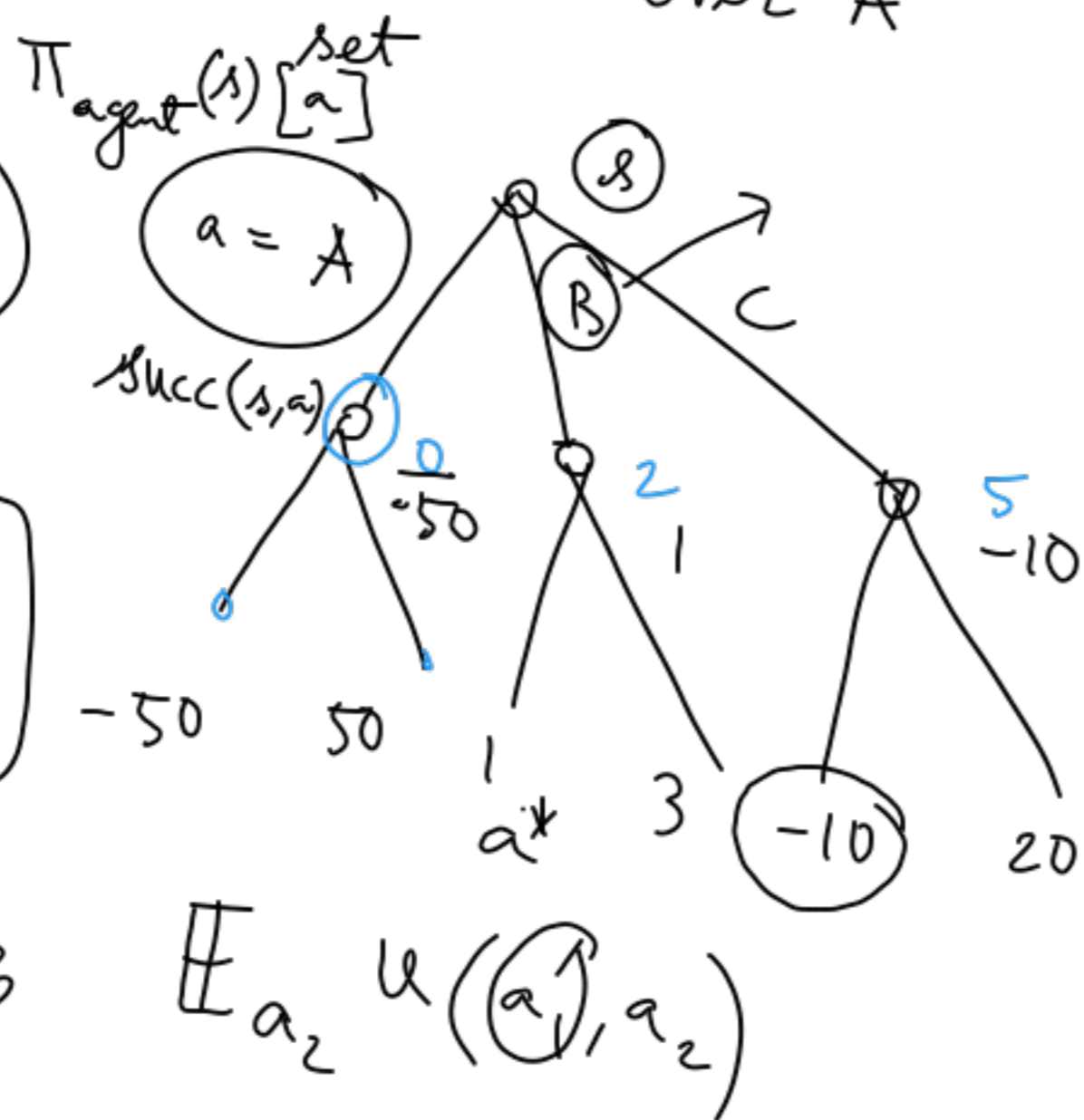
deterministic:  $\pi_i(s) \in \text{actions}(s)$   
if  $\text{player}(s) = i$

randomized:  $\pi_i(s) \in \Delta \text{actions}(s)$

$$\pi_B(n_1) = \left(\frac{1}{3}, \frac{1}{3}, \frac{1}{3}\right)$$

$$\left(\frac{2}{3}, \frac{1}{3}, 0\right)$$

$\Delta A =$  set of all probability dist. over  $A$



$$= \operatorname{argmax}_{a_1 \in L_1} \min_{a_2 \in L_2} u(a_1, a_2)$$

$$\max_{a_1 \in L_1} \mathbb{E}_{a_2} u(a_1, a_2) \geq$$

$$\mathbb{E}_{a_2} u(a_1^*, a_2)$$

# Games with partial information

$$u_{\text{agent}}(s) = \sum_{a \in \text{actions}(s)} \underbrace{\pi_{\text{agent}}(s)[a]}_{\text{prob. that agent picks action } a} u_{\text{agent}}(\text{succ}(s, a))$$

if  $\text{isEnd}(s)$

if  $\text{player}(s) = \text{agent}$

$$\sum_{a \in \text{actions}(s)} \pi_{\text{opp}}(s)[a] u_{\text{agent}}(\text{succ}(s, a))$$

if  $\text{player}(s) = \text{opp}$

opp is stochastic  
player is utility maximizer  $\rightarrow \max$

$\max_{a \in \text{actions}(s)}$

$\min_{a \in \text{actions}(s)}$



Opp is utility minimizer for agent  $\rightarrow$  min

$$U_{\text{agent}}(s) = \begin{cases} \text{utility}(s) & \text{if } \text{isEnd}(s) \\ \max_{a \in \text{actions}(s)} U_{\text{agent}}(\text{succ}(s,a)) & \text{if } \text{player}(s) = \text{agent} \\ \min_{a \in \text{actions}(s)} U_{\text{agent}}(\text{succ}(s,a)) & \text{if } \text{player}(s) = \text{opp} \end{cases}$$

$$\pi_{\text{agent}}^{\text{maxmin}}(n_1) = B$$

$$\pi_{\text{opp}}^{\text{min}}(n_2) \text{ minimizing player's utility}$$

Q:  $\pi_{\text{agent}}^{\text{maxmin}}$  is optimal  $\pi_{\text{opp}}^{\text{stoc' stic}}?$

A: NO.

$\rightarrow$  Equilibrium  $(\pi_{\text{agent}}^{\text{maxmin}}, \pi_{\text{opp}}^{\text{min}})$

$(\pi_{\text{agent}}^{\text{sto}}, \pi_{\text{opp}}^{\text{sto}}) \rightarrow$  not equilibrium

## Subgame and Subgame Perfection

A subgame at  $s$  is the restriction of the game at the subtree rooted at  $s$ .

where  $\text{isEnd}(s)$  is false.

Subgame Perfect Equilibrium is an equilibrium at every subgame.



## Backward Induction:

function BackInd( $s$ )

if isEnd( $s$ )

return  $u_{\text{agent}}(s), \emptyset$

if  $\text{player}(s) = \text{agent}$  then

bestUtil =  $-\infty$   $+\infty$

forall  $a \in \text{actions}(s)$  do

utilAtChild, bestAvec  $\leftarrow$  BackInd(succ( $s, a$ ))

if utilAtChild  $>$  bestUtil do

bestUtil = utilAtChild

bestAvec = append( $a, \text{bestAvec}$ )

return bestUtil, bestAvec.

## Why play chess still?

Go, checker, TTT

Checkers game tree  $\sim 10^{20}$  nodes

Chess  $\sim 10^{40}$  nodes

Go  $\sim 10^{170}$  nodes

Solved in 2007  $\rightarrow$  18 years of computation

it was a draw.

Speedup techniques

