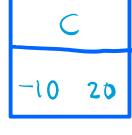
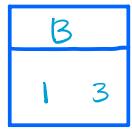


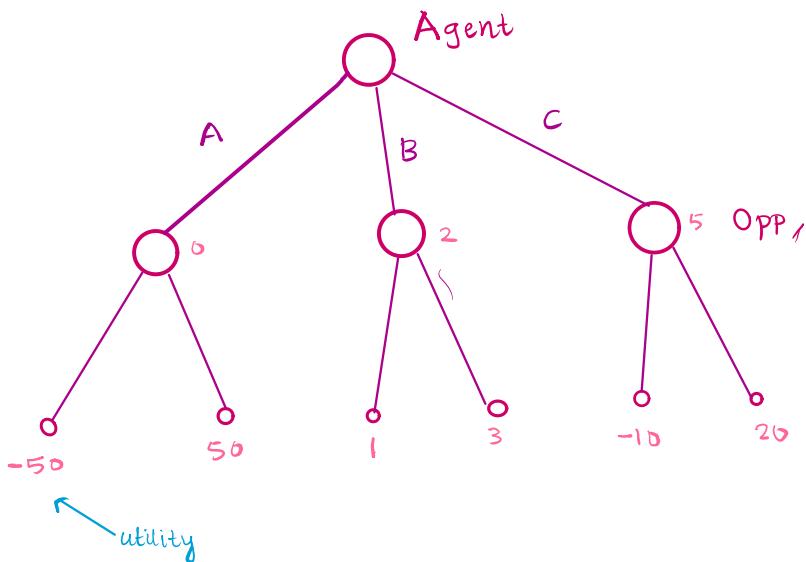
Recall the game we discussed last lecture. There are three buckets - Two players



Agent: Picks a bucket

Opponent: Pick a no. from selected bucket -

Game tree:



- If opponent is stochastic (prob = 1/2) maximise expected.

- If opponent is min player choose maximum among minimums.

Similarly strategy depends on opponent behaviour.

## Two player Zero-sum Game (Sequential mode)

Players = {agent, opponent}

$s_0$  = starting state

actions ( $s$ ) = possible actions at a state  $s$ .

Player ( $s$ ) = the player who makes the move at state  $s$ .  
s is an intermediate state

$\text{Succ}(s,a)$  = resulting state if action 'a' is taken at state 's'

$\text{isEnd}(s)$  = is State  $s$  an end state

$\text{utility}(s)$  = agent's utility at an end-state,  $s$ .

Example: (Chess)

Players = {white, black}

$s$  = a board position

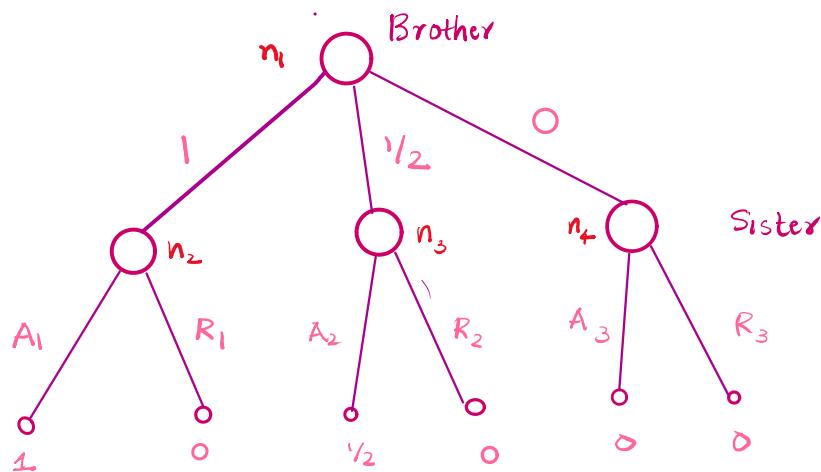
actions( $s$ ) = all legal moves by the player  $s$ .

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

$$\text{Utility}(s) = \begin{cases} +M & \text{if white wins} \\ -M & \text{if white loses} \\ 0 & \text{if draw} \end{cases}$$

### Constant sum game

Consider a Brother and Sister. They want to divide chocolate among themselves as shown below:



$A_i$  = accept

$R_i$  = reject.

Players =  $\{B, S\}$

$$\text{actions}(s) = \begin{cases} \{1, 1/2, 0\}, s = n_1 \\ \{A_1, R_1\}, s = n_2 \\ \{A_2, R_2\}, s = n_3 \\ \{A_3, R_3\}, s = n_4 \end{cases}$$

### Strategy of a player

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

Randomized strategy:  $\pi_i(s) \in \Delta^{\text{actions}(s)}$  eg:  $\pi_B(n_1) = \left(\frac{1}{3}, \frac{1}{3}, \frac{1}{3}\right)$

$\Delta^A$  = set of all probability distributions over  $A$ .

### Games with partial information:

$$u_{\text{agent}}(s) = \begin{cases} \text{utility}(s) & \text{if } \text{isEnd}(s) \\ \sum_{a \in \text{actions}(s)} \pi_{\text{agent}}^{(s)}[a] \cdot u_{\text{agent}}(\text{succ}(s, a)) & \text{if } \text{player}(s) = \text{agent} \\ \sum_{a \in \text{actions}(s)} \pi_{\text{opponent}}^{(s)}[a] \cdot u_{\text{agent}}(\text{succ}(s, a)) & \text{if } \text{player}(s) = \text{opponent} \end{cases}$$

↑ probability that agent picks action  $a$

# Opponent is stochastic, but player is utility maximizer (max-player)

In max player case instead of summation,

we can use

$$\max_{a \in \text{actions}(s)} \pi_{\text{agent}}^{(s)}[a] \cdot u_{\text{agent}}(\text{succ}(s, a)) \quad \text{if } \text{player}(s) = \text{agent}$$

↑ probability that agent picks action  $a$

# Opponent is utility minimizer for agent (min player)

$$\min_{a \in \text{actions}(s)} \pi_{\text{opponent}}^{(s)}[a] \cdot u_{\text{agent}}(\text{succ}(s, a)) \quad \text{if } \text{player}(s) = \text{opponent}$$

So we've the following:

$$u_{\text{agent}}(s) = \begin{cases} \text{utility}(s) & \text{if } \text{isEnd}(s) \\ \max_{a \in \text{actions}(s)} \pi_{\text{agent}}^{(s)}[a] \cdot u_{\text{agent}}(\text{succ}(s, a)) & \text{if } \text{player}(s) = \text{agent} \\ \min_{a \in \text{actions}(s)} \pi_{\text{opponent}}^{(s)}[a] \cdot u_{\text{agent}}(\text{succ}(s, a)) & \text{if } \text{player}(s) = \text{opponent} \end{cases}$$

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

$$\pi_{\text{opponent}}^{\text{minimum}}(n_2) \text{ minimizing player's utility}$$

Q: Is  $\pi_{\text{agent}}^{\text{maximum}}$  optimal if  $\pi_{\text{opponent}}$  is stochastic?

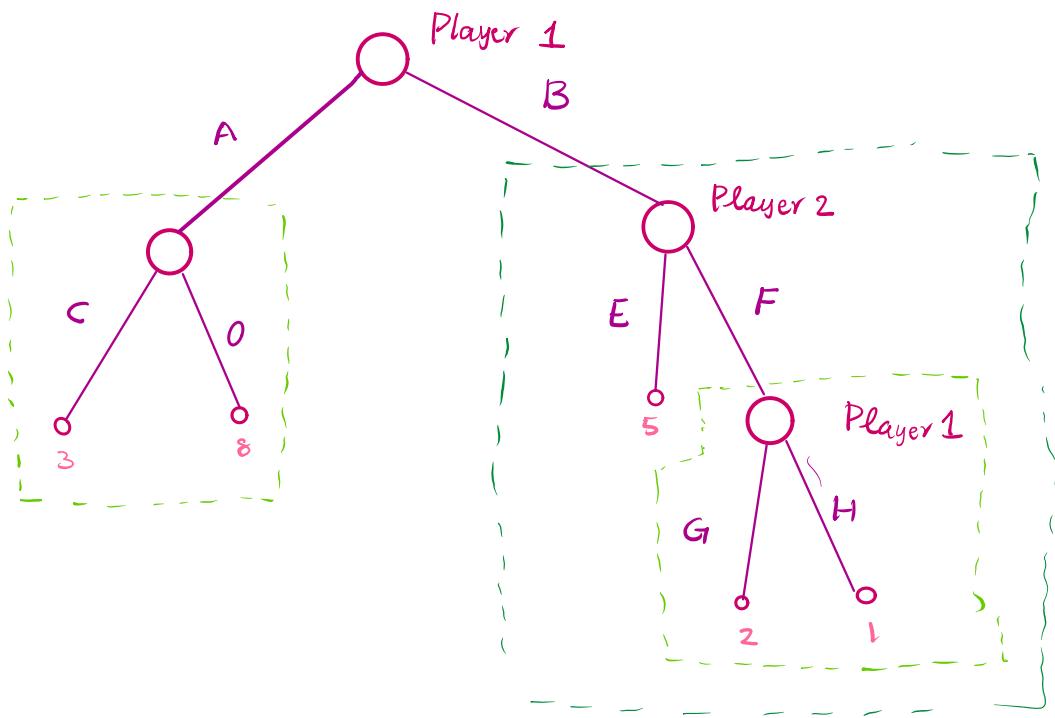
Ans: NO! Depends on opponent.

In fact, we don't have an optimal policy but an equilibrium policy.

Equilibrium ( $\Pi_{\text{agent}}^{\max}, \Pi_{\text{opp.}}^{\min}$ )

Notice that  $(\Pi_{\text{agent}}^{\text{stoc.}}, \Pi_{\text{opp.}}^{\text{stoc.}})$  is not equilibrium.

## Subgame and Subgame Perfection

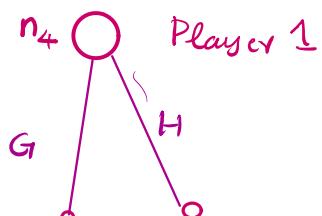


A subgame at  $s$  is the restriction of the game at the subtree rooted at  $s$  where  $\text{End}(s)$  is false.

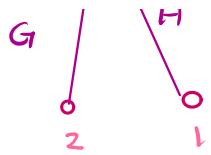
Player 1 is max  $\rightarrow \arg \max_{a \in \text{actions}(s)} u_{\text{agent}}(\text{succ}(s, a))$

Player 2 is min  $\rightarrow \arg \min_{a \in \text{actions}(s)} u_{\text{agent}}(\text{succ}(s, a))$

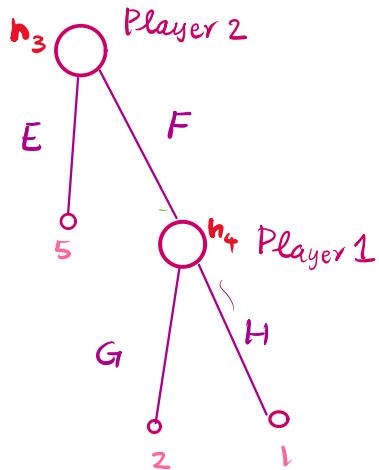
Consider the following subgame



At  $n_4$ , Player 1 should pick G

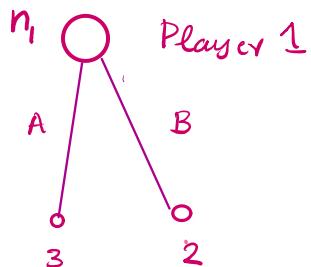


Consider this subgame:



At  $n_3$ , player 2 should pick F  
At  $n_2$ , player 2 should pick C  
(in the other subgame)

In the entire game,  
after these choices we've



At  $n_1$ , player 1 should pick A

Subgame Perfect Equilibrium is an equilibrium at every subgame

### Backward Induction:

function BackInd( $s$ ) :

- if isEnd( $s$ ):  
    return  $n_{agent}^{(s)}, \emptyset$
- if player( $s$ ) = agent
  - bestUtil =  $-\infty$
  - for all  $a \in actions(s)$ ; do:
    - # utilAtChild, bestAvail  $\leftarrow$  BackInd(succ( $s, a$ ))
    - # if utilAtChild > bestUtil:
      - utilAtChild = utilAtChild +  $r_{child}$

```
# if utilAtChild > bestUtil:  
+ bestUtil = UtilAtChild  
* bestAVect = append(a, bestAVect)
```

- If player(s) = opponent do reverse, i.e min strategy.
- return bestUtil, bestAVect.

Can we use this to play Chess, Go, Checkers?

The game tree of Checkers has  $10^{20}$  nodes

The game tree of Chess has  $10^{40}$  nodes

" Go has  $10^{170}$  nodes.

For checkers, it was solved in 2007 after 18 years of computation  
(to get a draw 😊!)