

Game playing programs

2-player, 0-sum games (one wins, one loses)

Players both see relevant info

↳ chess

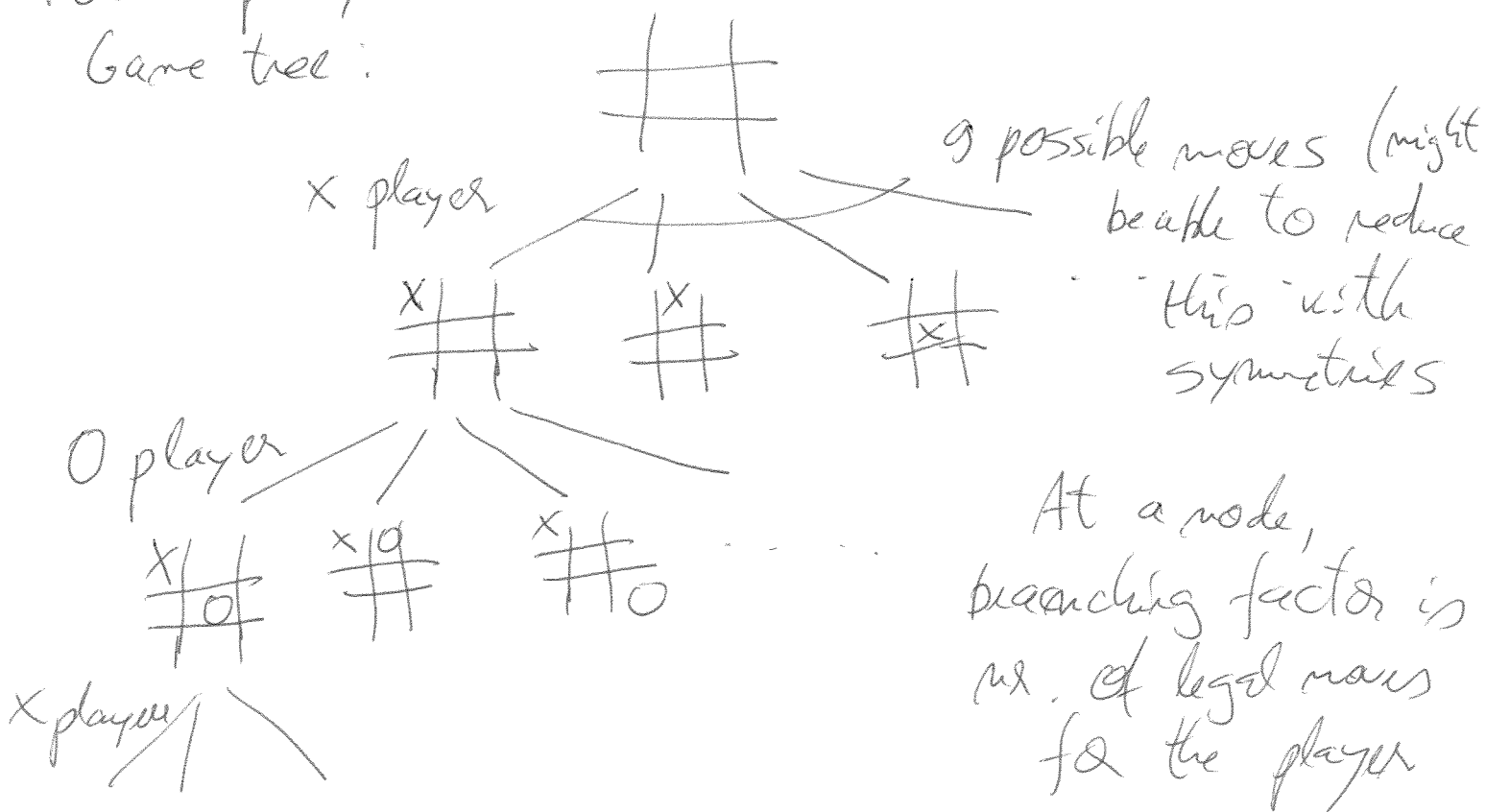
↳ checkers

↳ go

Not Poker, other card games

How to play well? → Data structures

Game tree:



X	O	
	X	O
		X

Outcome: +1 (win for X)

X	O	
X	O	X
	O	X

-1 (loss for X)

ties

X: find a path to a +1 leaf $\rightarrow$ max player

O: -1 leaf $\rightarrow$ min player

Size of game tree is huge!

$\rightarrow$ branching factor (no. of legal moves)

$\rightarrow$ length of the game (how many moves to the end)

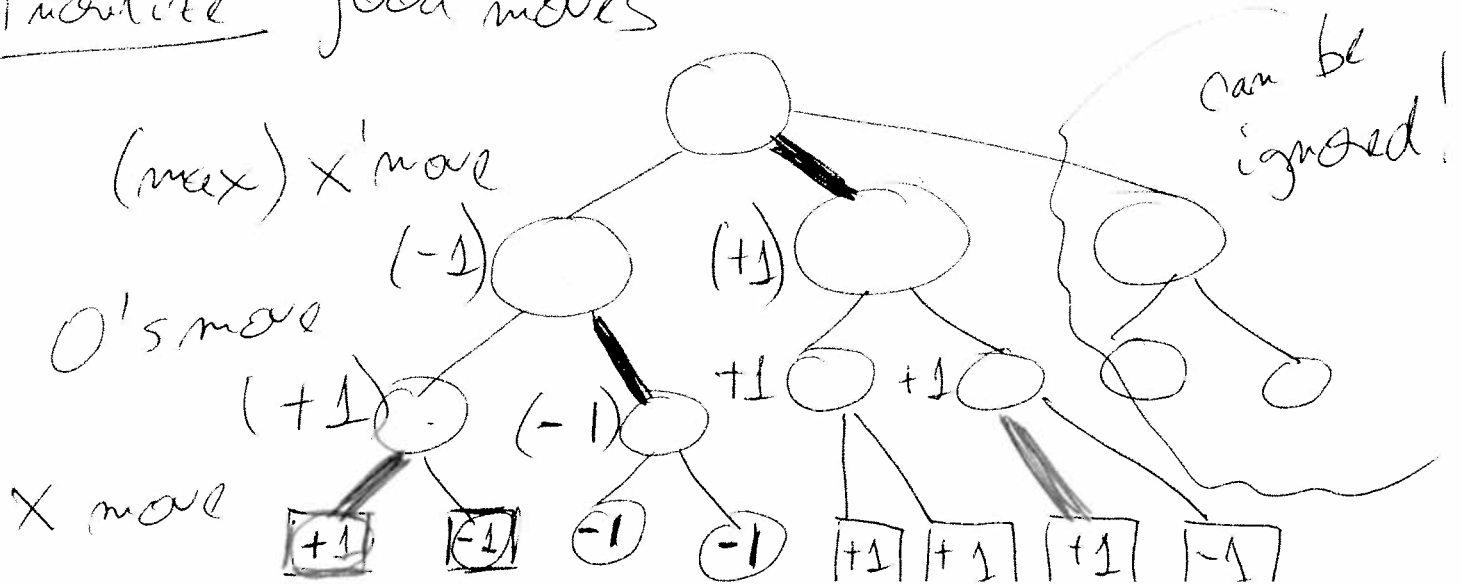
Chess: branching factor ≈ 20
depth > 40

Go: branching factor ≈ 40
depth > 100

Legal boards $\approx 10^{300}$

- a) Evaluating (approximately) a board position
b) search strategy $\rightarrow$ focus on lines of play that are promising

Prioritize good moves



Max nodes (X's moves)
Min nodes (O's moves).

Recursion: base case is the leaves (aka positions where outcome is known)

Recursion $\rightarrow$ compute value of a node as max or min of children

$\Rightarrow$ Minimax search

Cutoff the tree at a given depth $\rightarrow$ evaluation fn with "guess" (est) value of a position

Pruning (α - β pruning) $\rightarrow$ not going to search lines of play that cannot be better than the at. best.

Algorithm Minimax Value (Board b , boolean min or max, int depth)

Output: value of board pos.

if depth = 0 return evalFn (b)

if (min or max = true) // min node

$b \in$ successors of b $\text{Minimax Value } (b', \neg \text{min or max, depth} - 1)$

else max

- Not generate successors worse than what we can get so far
- Not investigate successors for which eval (b') is bad

eval () $\rightarrow$ ask an expert!

e.g. $\text{pawn} = 1$
 $\text{rook} = 3$
 $\text{queen} = 7$

} value of board
(simplistically) =
sum of vals of pieces

"mobility"
"territory dominance"
patterns

} features $\rightarrow$ simple
quantity that measures
approximately something
important about the game
(domain knowledge)

Combining features: linear combination:

$$\text{eval}(b) = \sum w_i \underbrace{f_i(b)}_{\text{features}}$$

e.g. w_i for pieces you own is pos
Opponent neg

How to come up with w_i s (??)

L36-5

→ Team of experts!

Eg. 1995 → IBM Deep Blue beat Gary Kasparov
(chess world champion) → 1st time

→ Learn weights from data!
(machine learning)

Try-and-learn: play the game, using at
guess about the evaluation for weights
⇒ observe the outcome (+1 or -1)

Increase the value of all our choices & boards
(by a little bit)

(Decrease value of boards where opponent made the
move, from the opponent's point of view)

(small increment)

