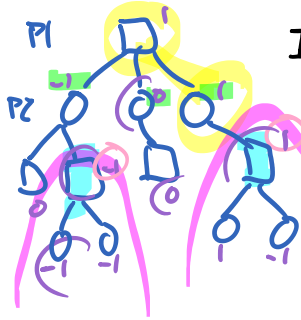


Sizes of Games

Minimax(pos)



If pos is terminal, return value determined by rules of game

- +1 if P1 win
- 0 draw
- 1 if P2 win

Else if pos is P1's turn then return $\max_{pos \rightarrow pos'} \text{Minimax}(pos')$

Else return $\min_{pos \rightarrow pos'} \text{Minimax}(pos')$

001010

- Tic-Tac-Toe $\leq 3^9$
- Mancala $2 \cdot \binom{36+13}{13} = \binom{49}{13} \cdot 2 \approx \underline{500 \text{ billion}}$ $b \approx 4$ $d \approx 36$ $b^d = 4^{36} = 2^{72} \approx 10^{22}$ or 10^{18} using better estimates
- 2-player Tahtzee $4 \cdot 10^{18}$
- Checkers $\leq 10^{20}$
- Chess $\leq 10^{45}$
- Go $\leq 10^{172}$

http://en.wikipedia.org/wiki/Game_complexity

What to do with games of high complexity?

heuristics - estimates of positions' values that can be calculated quickly

Ex : checkers K:2 N:1

chess Q:9 R:5 B,k:3 P:1

- material strength
- mobility
- attack
- castling rights
- pawn position
- king safety

kalah: $\frac{\# \text{seed in P1 store} - \# \text{seeds in P2 store}}{36}$

Minimax(pos, h, d)

\nwarrow how deep to search tree
 \swarrow determined by rules

If pos is terminal, return $\text{value}(pos)$

If $d=0$ return $h(pos)$

Else if pos is P1's turn then return $\max_{pos \rightarrow pos'} \text{MM}(pos', h, \underline{d-1})$

Else return $\min \text{MM}(pos', h, d-1)$

pos \rightarrow pos'

Negamax (pos, h, depth, sign)

if pos is terminal return value (pos)

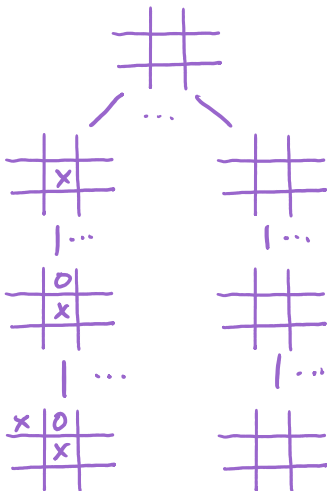
if depth == 0 , return h(pos)

else return max_{pos \rightarrow pos'} MM(pos', h, depth-1, >

Iterative Deepening - get result from as deep a MM search as possible
have result available at any time

depth \leftarrow 2

Transposition Table



save values for positions in case they reappear at other pos
in tree

Minimax w/ Transposition Table

Minimax (pos, h, d)

If pos is terminal, return value(pos)

If depth == 0, return h(pos)

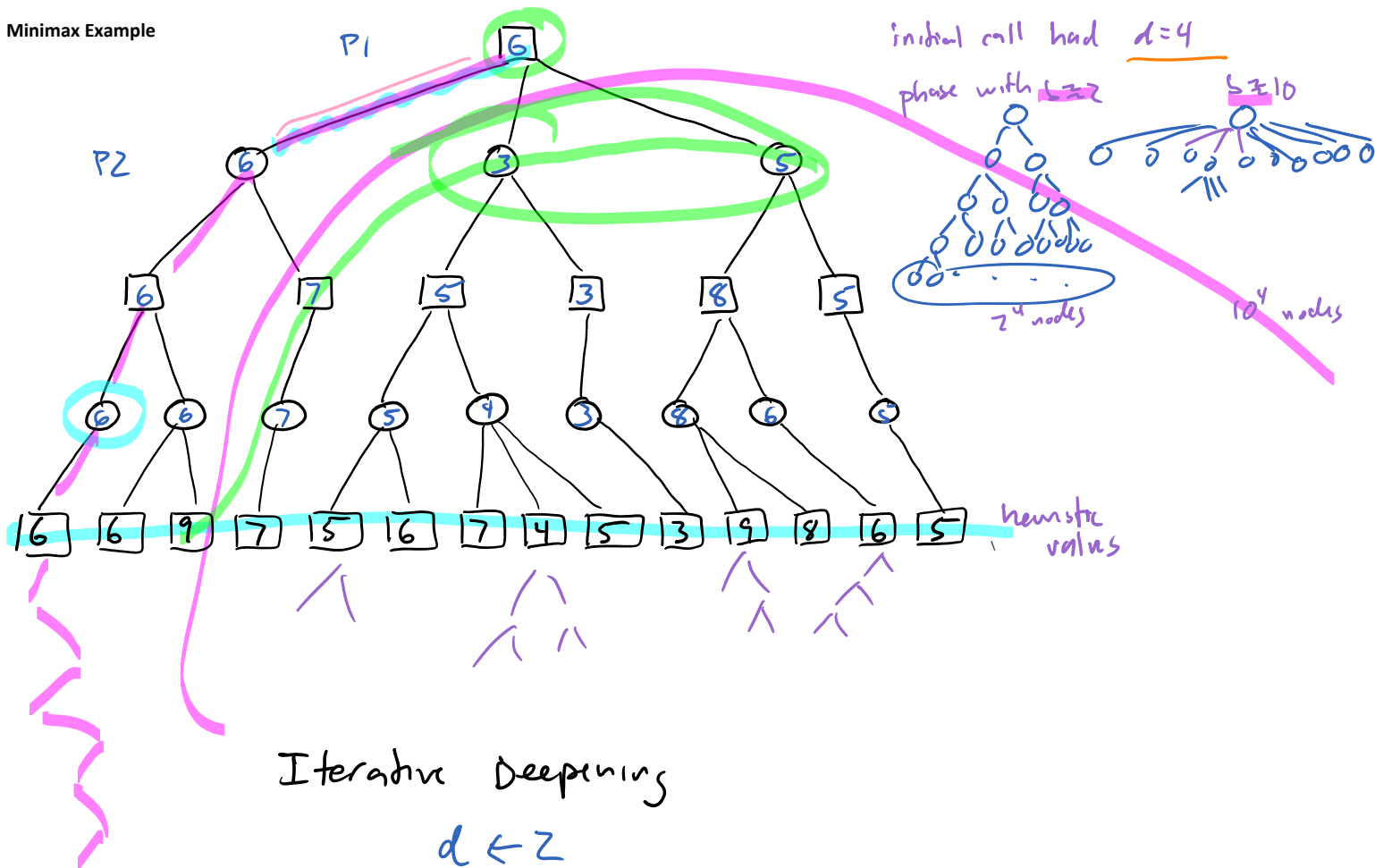
Else if pos is P1's turn then

return $\max_{pos \rightarrow pos'}$ MM(pos', h, d-1)

Else

return $\min_{pos \rightarrow pos'}$ MM(pos', h, d-1)

Minimax Example



Iterative Deepening

$d \leftarrow 2$

while time left

max, value \leftarrow MM(pos, h, d)

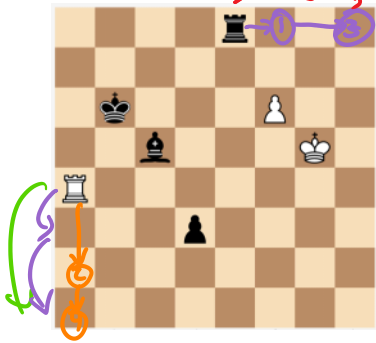
$d \leftarrow d+1$

return result from last completed MM

Transposition Table

like memo, but allowed to remove entries when out of space → use some cache replacement policy

Positions may be reachable by multiple sequences of moves



Keep table of values for all positions examined in tree



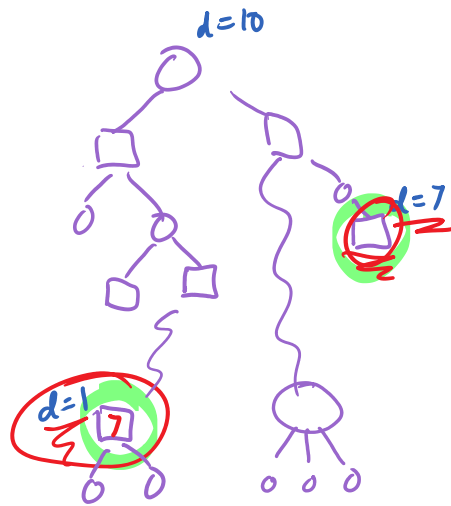
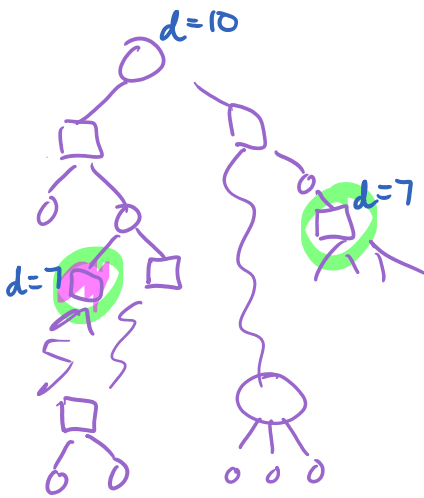
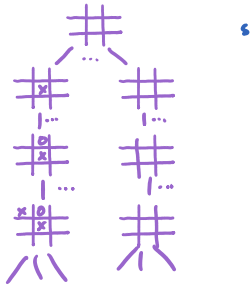
Keys: positions, depth

Values: values computed by minimax

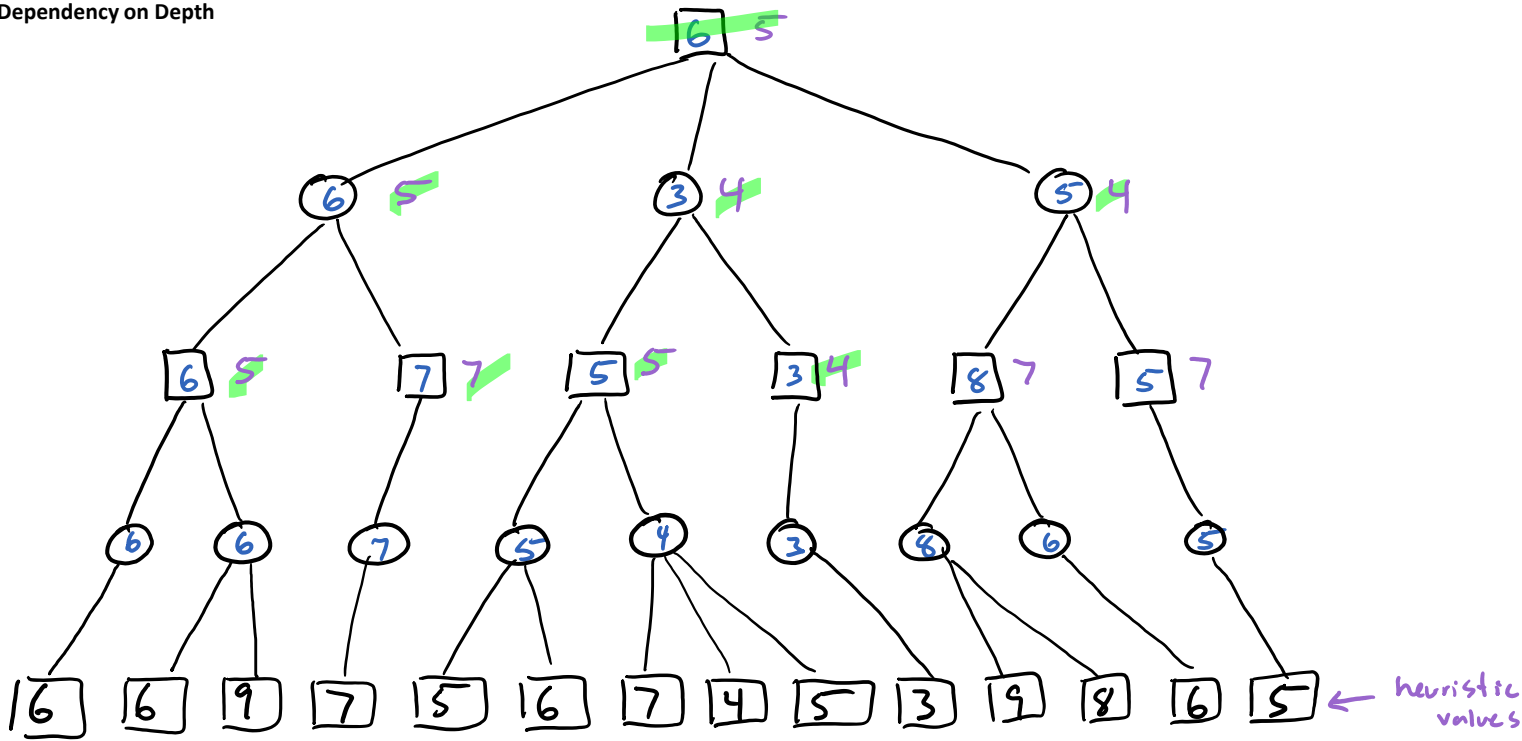
Add check at start of Minimax

if pos in tt, return value from tt w/ depth $\geq d$

Save returned values in table



Dependency on Depth



Modified example from http://en.wikipedia.org/wiki/Alpha%E2%80%93beta_pruning