

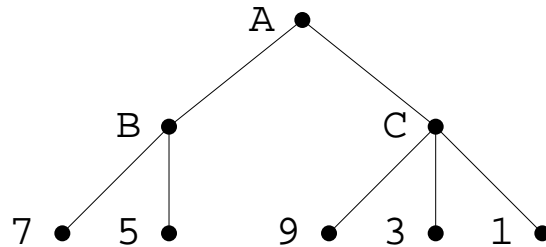
## alpha-beta minimax pruning

- two-player game tree minimax computation:
  - alpha/cutoffs allow subtree pruning
- worst case: no subtrees pruned, all leaves examined
- for each node, on the path from that node to the root,
  - *alpha* best already-seen option for MAX
  - *beta* best already-seen option for MIN
- example on next page:
  - compute minimax with DFS
  - update alpha/beta at each node
  - use these values to compute minimax at each node
- Pieter Abbeel video <https://www.youtube.com/watch?v=xBXHtz4Gbdo>

## computing minimax, alpha, beta at a node

- for all internal MAX nodes, initialize mmx val,  $\alpha$  to  $-\infty$
- for all internal MIN nodes, initialize mmx val,  $\beta$  to  $+\infty$
- traverse nodes DFS order
  - arrive at node: update  $v$ ,  $\alpha/\beta$
- backing up to node:
  - update  $v$ ,  $\alpha$  (if MAX),  $\beta$  (if MIN)
  - before descent to next child: can we prune?
  - prune if  $\alpha > \beta$ 
    - (at MAX: MIN has better option elsewhere)
    - (at MIN: MAX has better option elsewhere)

- **exercise.** trace on this tree. show each update.  
check answer with `alphabetalpha/alpha.py`



- **answer.** from A, descend to B. from B, descend to leaf 7. from leaf 7, backup:  $v(B) \leftarrow \beta(B) \leftarrow 7$ . **can we prune?** no:  $v(B) = \beta(B)$  so descend to leaf 5. from leaf 5, backup:  $v(B) \leftarrow \beta(B) \leftarrow 5$ . from B, backup:  $v(A) \leftarrow \alpha(A) \leftarrow 5$ .  $v(A) = \alpha(A)$  so descend to C:  $\alpha(C) \leftarrow 5$ . from C, descend to leaf 9. from leaf 9, backup:  $v(C) \leftarrow \beta(C) \leftarrow 9$ . **can we prune?** no:  $v(C) = 9 > \alpha(C) = 5$  so descend to leaf 9. from leaf 3, backup:  $v(C) \leftarrow \beta(C) \leftarrow 3$ . **can we prune?** yes:  $v(C) = 3 < \alpha(C) = 5$  so backup now (effectively pruning C's remaining children leaf 3, leaf 1). from C, backup to A:  $v(A) \leftarrow \alpha(A) \leftarrow 5$ . from A, backup. done.

**prune:  $\alpha > \beta$  or  $\alpha \geq \beta$  ?**

- $\alpha > \beta$  ?
- on path-to-root, **better** opponent move elsewhere  
pointless to continue search at current node: backup
- $\alpha = \beta$  ?
- on path-to-root, **as good** opponent move elsewhere  
current node: score can only get worse for opponent  
opponent guaranteed to have **some** best move elsewhere  
pointless to continue search at current node: backup
- example: assume all leaf nodes have same MAX-score
  - how much pruning with cutoff  $\alpha > \beta$ ?
  - answer: none
  - how much pruning with cutoff  $\alpha \geq \beta$ ?
  - answer: maximum amount of pruning possible :) **woo hoo**