

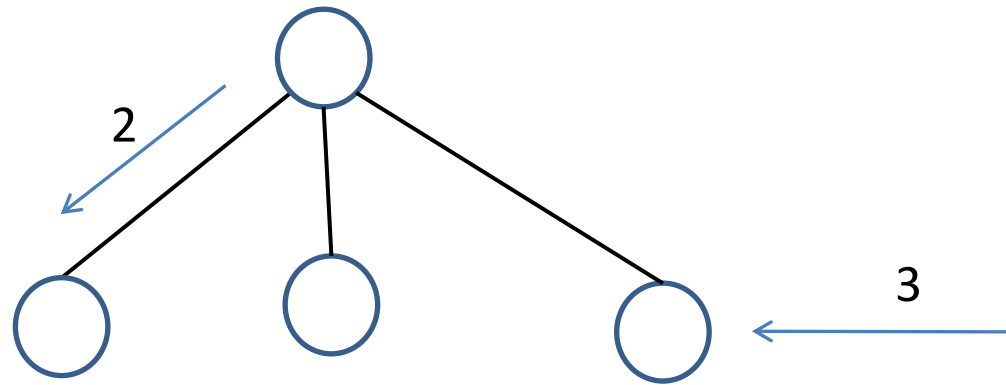
# Artificial Intelligence Fundamentals

Games, Minimax and Alpha-Beta

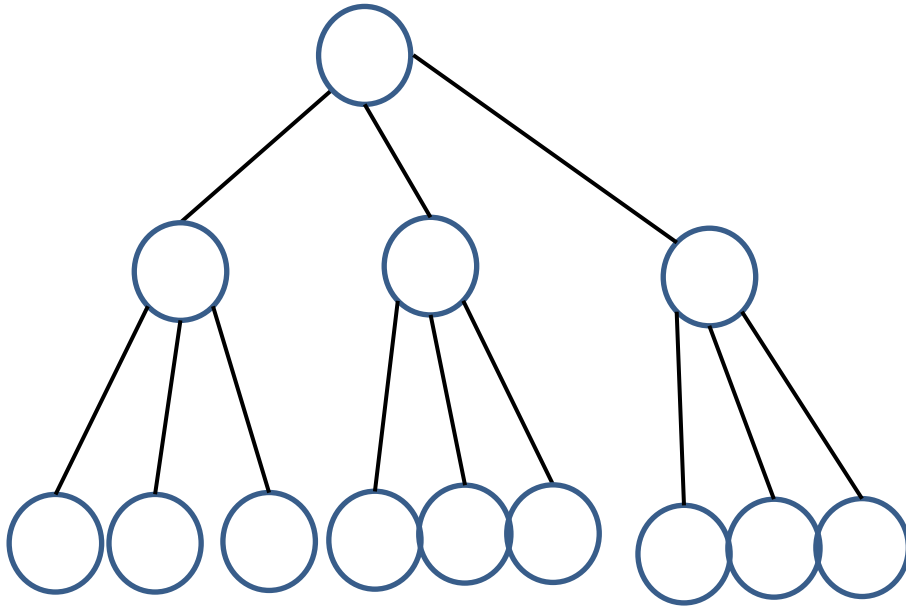
# How we design a computer program to play a game ?

1. Analysis of the board + Strategy + Tactics -> Mixed up and somehow results a move
2. IF THEN Rules – If you can make a move then do it
3. Look ahead and evaluate – static function – linear scoring polynomial

$$S = g(f_1, f_2, \dots, f_n) , \text{ where } f_i \text{ are features} \\ = c_1 f_1 + c_2 f_2 + \dots + c_n f_n$$



# Game tree



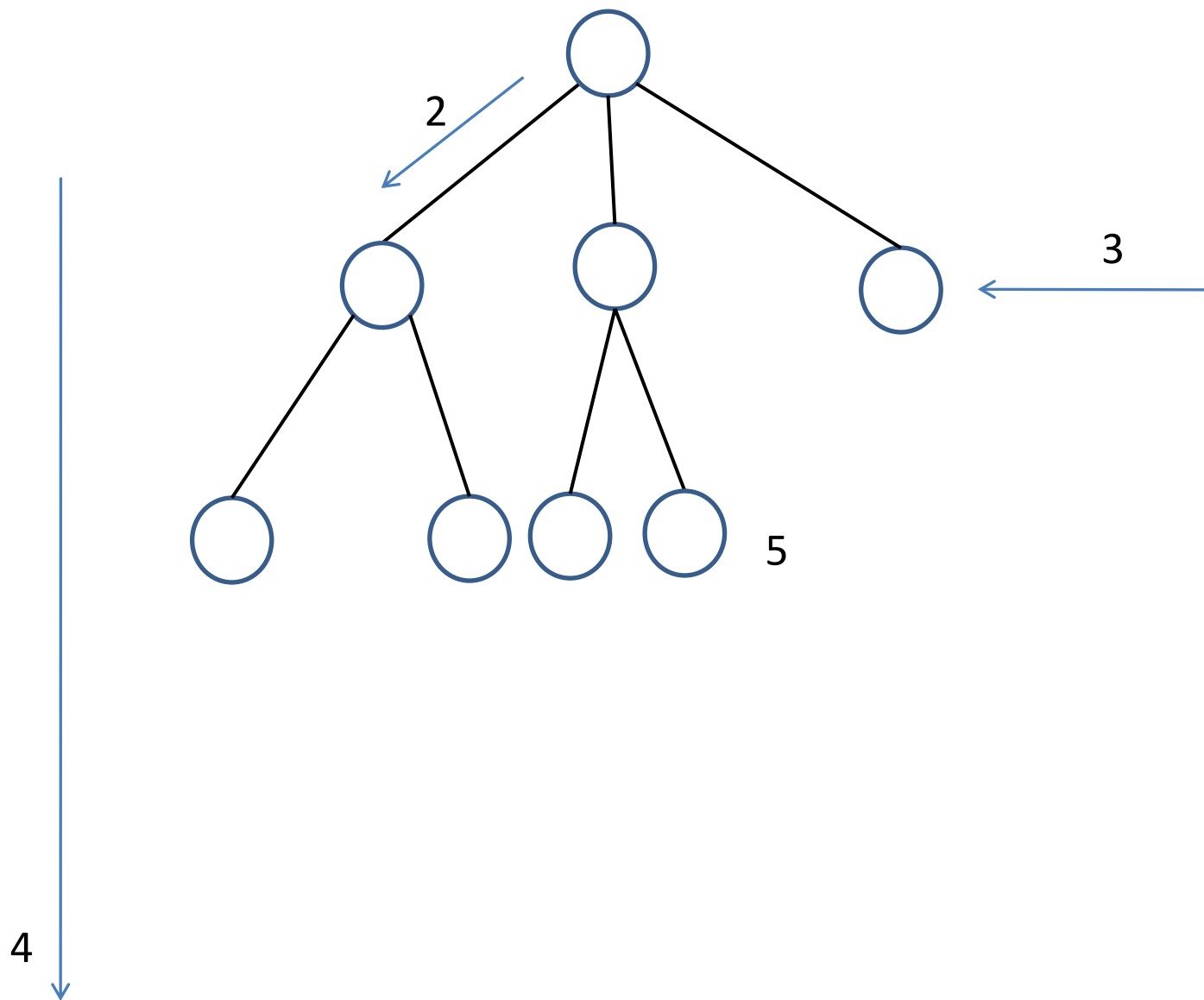
- Nodes – board configurations
- Branches – moves , transform one position into another
- $d$  – depth of the tree (2)
- $b$  – branching factor (3)
- $b^d$  – terminal leaves (9)

## 4. Exhaustive search – Chess example

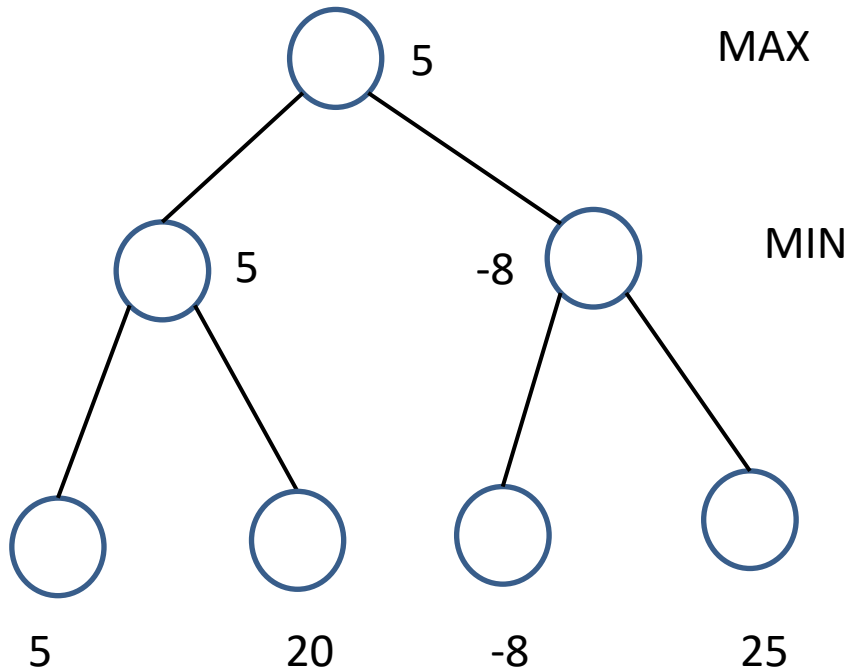
- Branching factor – 16
- Depth – 100
- Chess possibilities -  $10^{120}$ 
  - Universe contains -  $10^{80}$  atoms
  - 1 year –  $3 \times 10^7$  seconds
  - 1 sec -  $10^9$  nano sec
  - Time from the beginning of the universe -  $10^{10}$  years
  - Total –  $10^{106}$
- Analysis would be just getting started

## 5. Look ahead as far as possible

- Shannon & Turing
- Static evaluation – compute a number that reflects the board quality
  - Positive values favors one player (MAX player)
  - Negative values favors the other (MIN player)

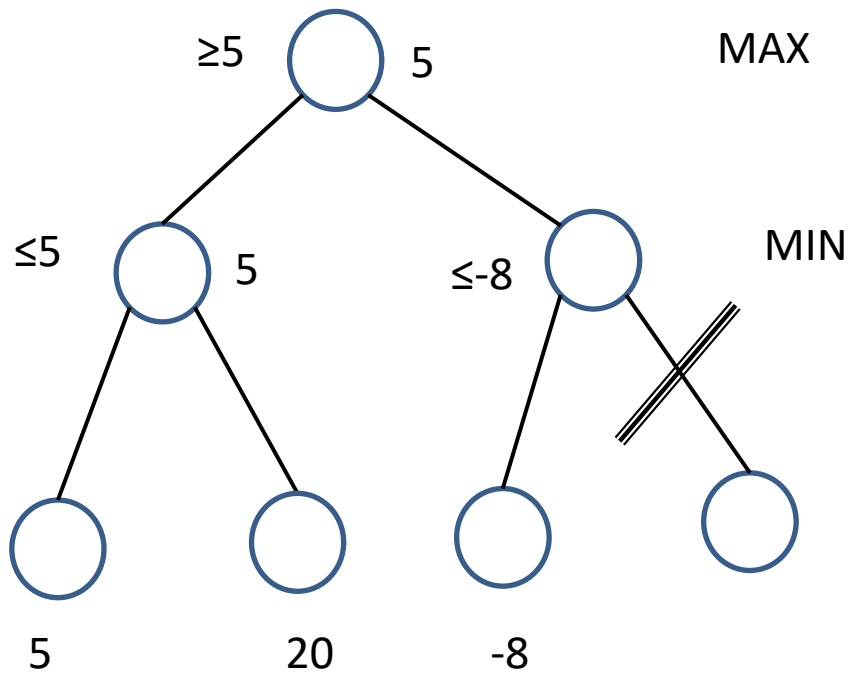


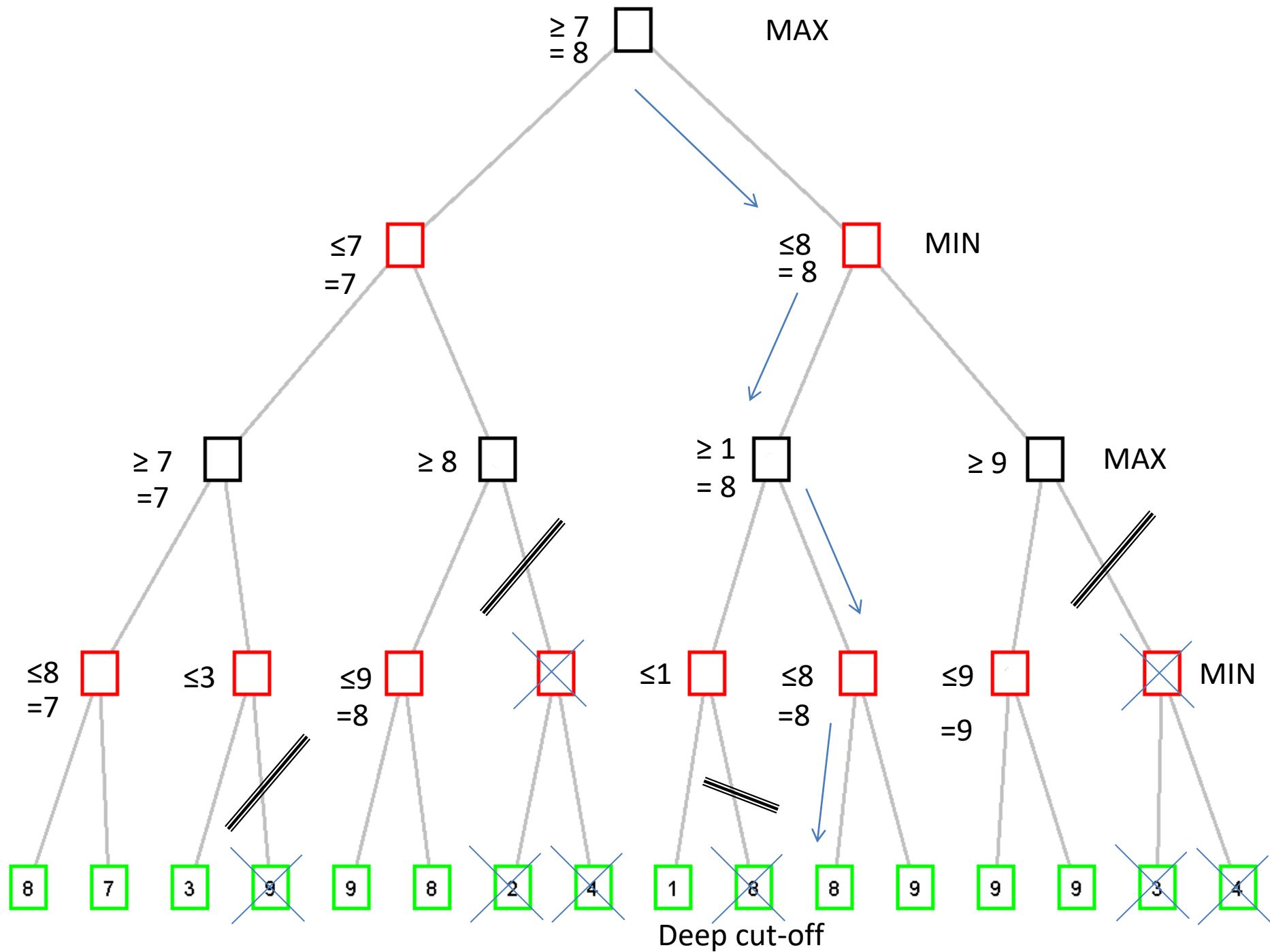
# Minimax





# Alpha Beta





# ALPHA-BETA algorithm

- If the level is the top, let alpha be  $-\infty$  and let beta be  $\infty$
- If the limit of search has been reached, compute the static value of the current position relative to the appropriate player. Report the result.
- If the level is a minimizing level
  - Until all children are examined with ALPHA-BETA or until alpha is equal to or greater than beta
    - Use ALPHA-BETA procedure, with the current alpha and beta values, on a child; note the value reported
    - Compare the value reported with the beta value; if the reported value is smaller, reset beta to the new value
  - Report beta
- Otherwise, the level is a maximizing level:
  - Until all children are examined with ALPHA-BETA or until alpha is equal to or greater than beta
    - Use ALPHA-BETA procedure, with the current alpha and beta values, on a child; note the value reported
    - Compare the value reported with the alpha value; if the reported value is larger, reset alpha to the new value
  - Report alpha

# Best-case and worst-case

- With ALPHA-BETA and for optimal arrangement, the number of static evaluations has the following formulae:

$$s = 2 * b^{\frac{d}{2}} - 1$$

- Worst –case -> no cuttings

$$s = b^d$$

# Progressive Deepening

- The branching factor is not always the same -> How deep can I go giving a certain amount of time?
- The number of nodes requiring static evaluation at the bottom of the tree is:

$$s = b^d$$

- The number of nodes in the rest of the tree is:

$$1 + b + b^2 + b^3 + \dots + b^{d-1} = \frac{b^d - 1}{b - 1}$$

- The ratio of the number of nodes in the bottom level to the number of nodes up to the bottom level is:

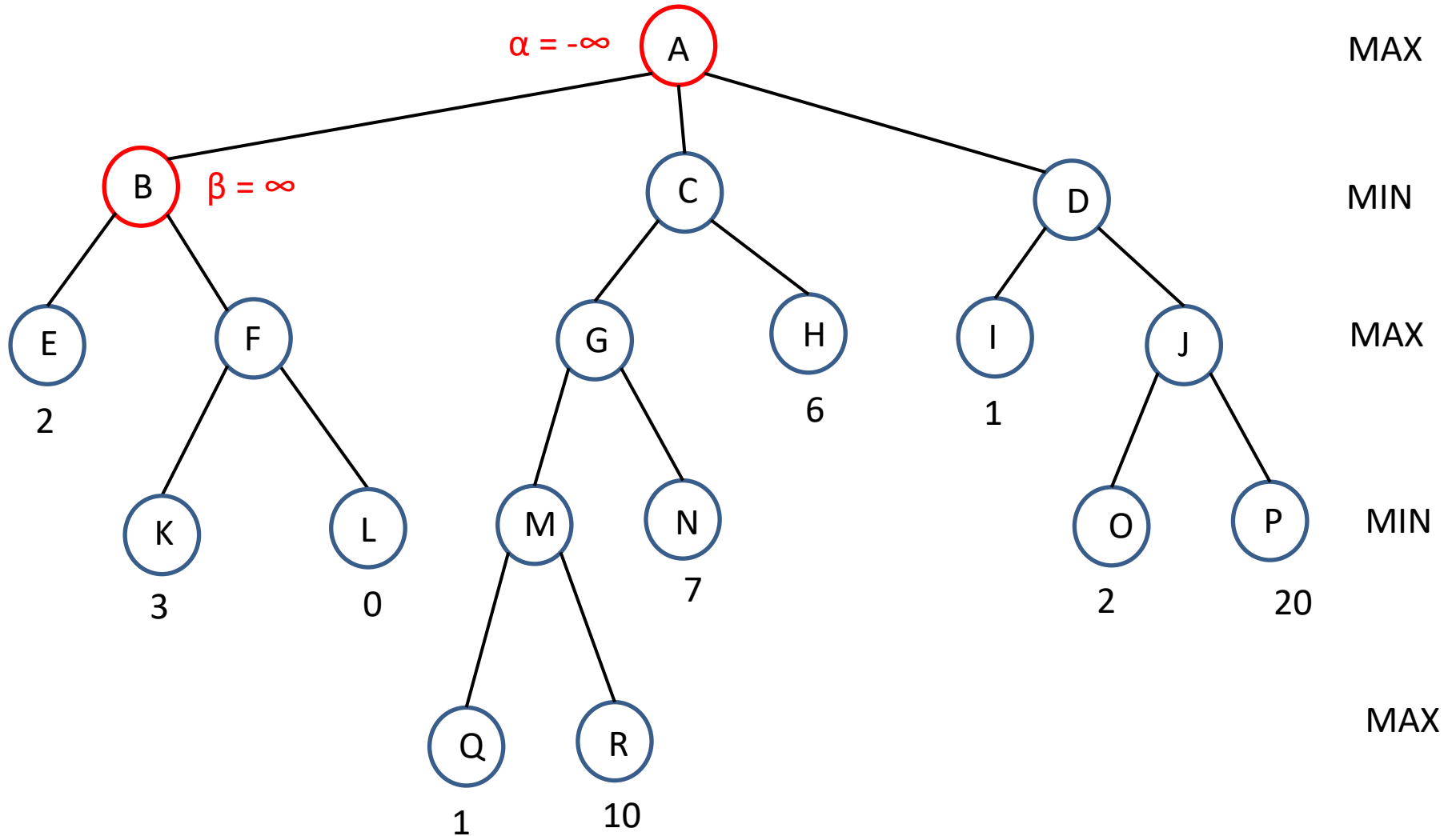
$$s = 1 + b + b^2 + b^3 + \dots + b^{d-1} = \frac{b^d - 1}{b - 1} \quad \text{ratio} = \frac{b^d}{\frac{b^d - 1}{b - 1}} \approx b - 1$$

- Improve the performance of ALPHA-BETA – reorder the nodes

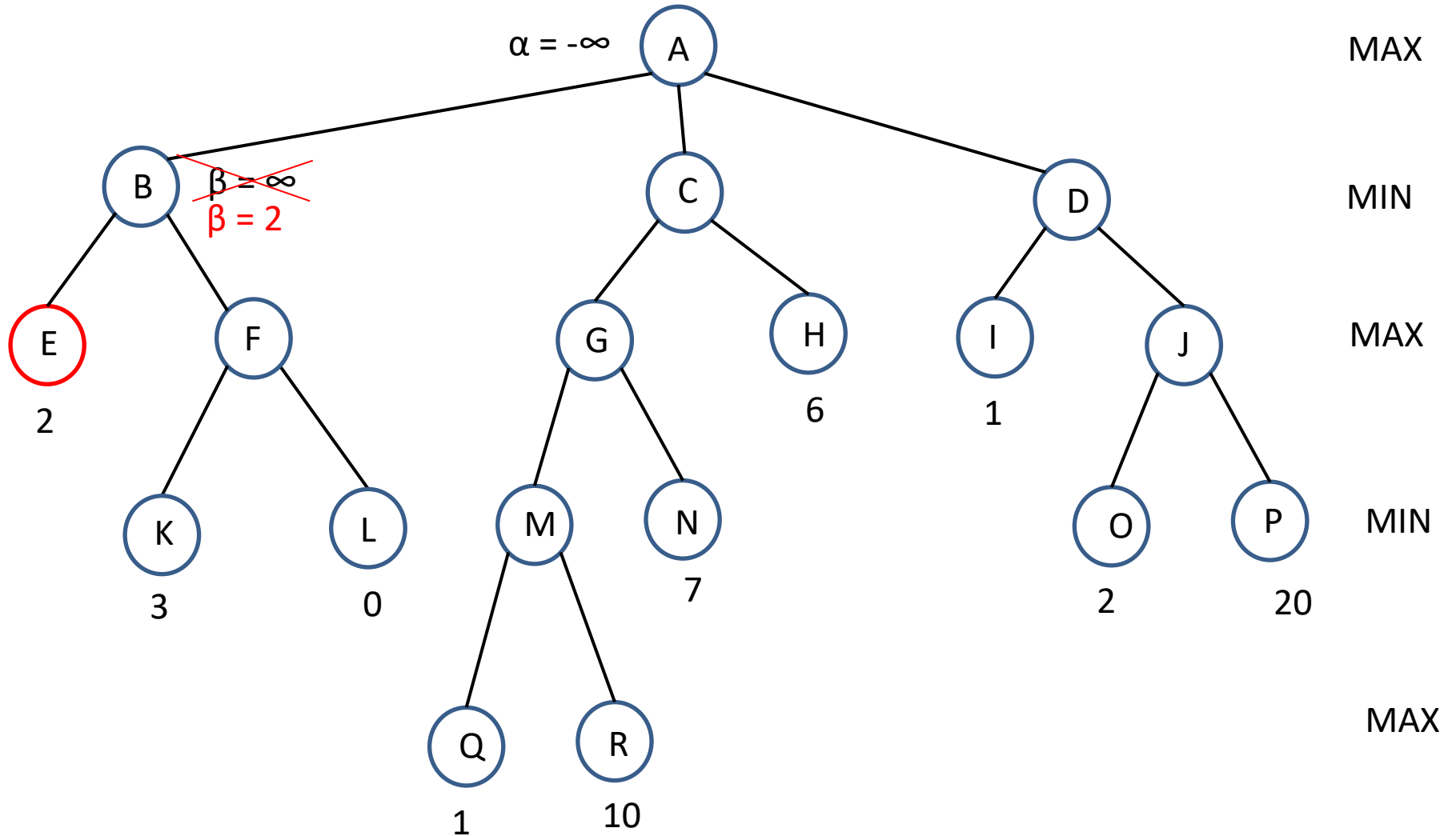
# Deep-Blue

- Minimax – 14-15 levels
- Alpha Beta
- Progressive Deepening
- Parallel computing
- Opening book
- End game special situations
- Uneven tree development

# Alpha Beta example

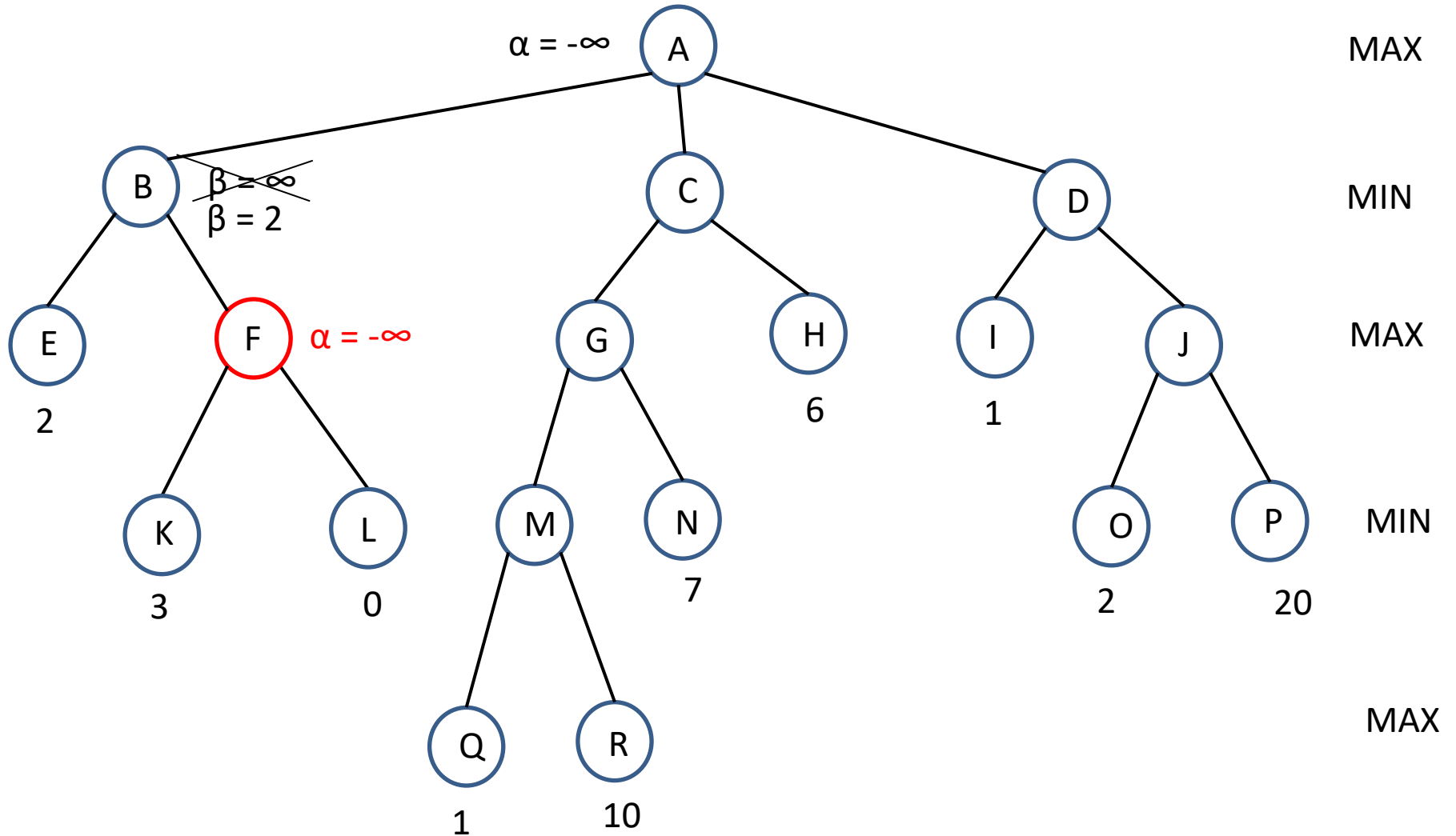


# Alpha Beta example

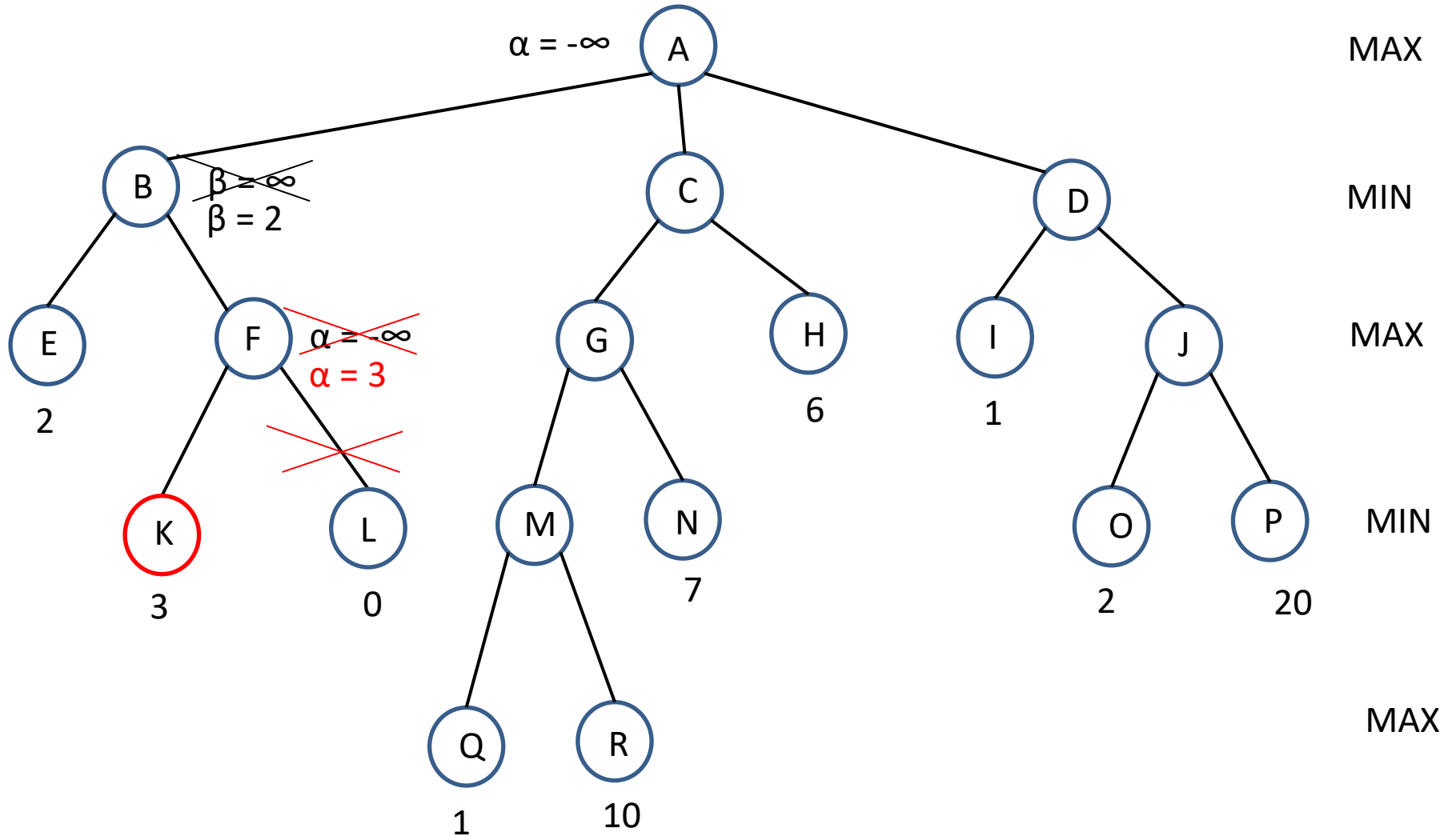




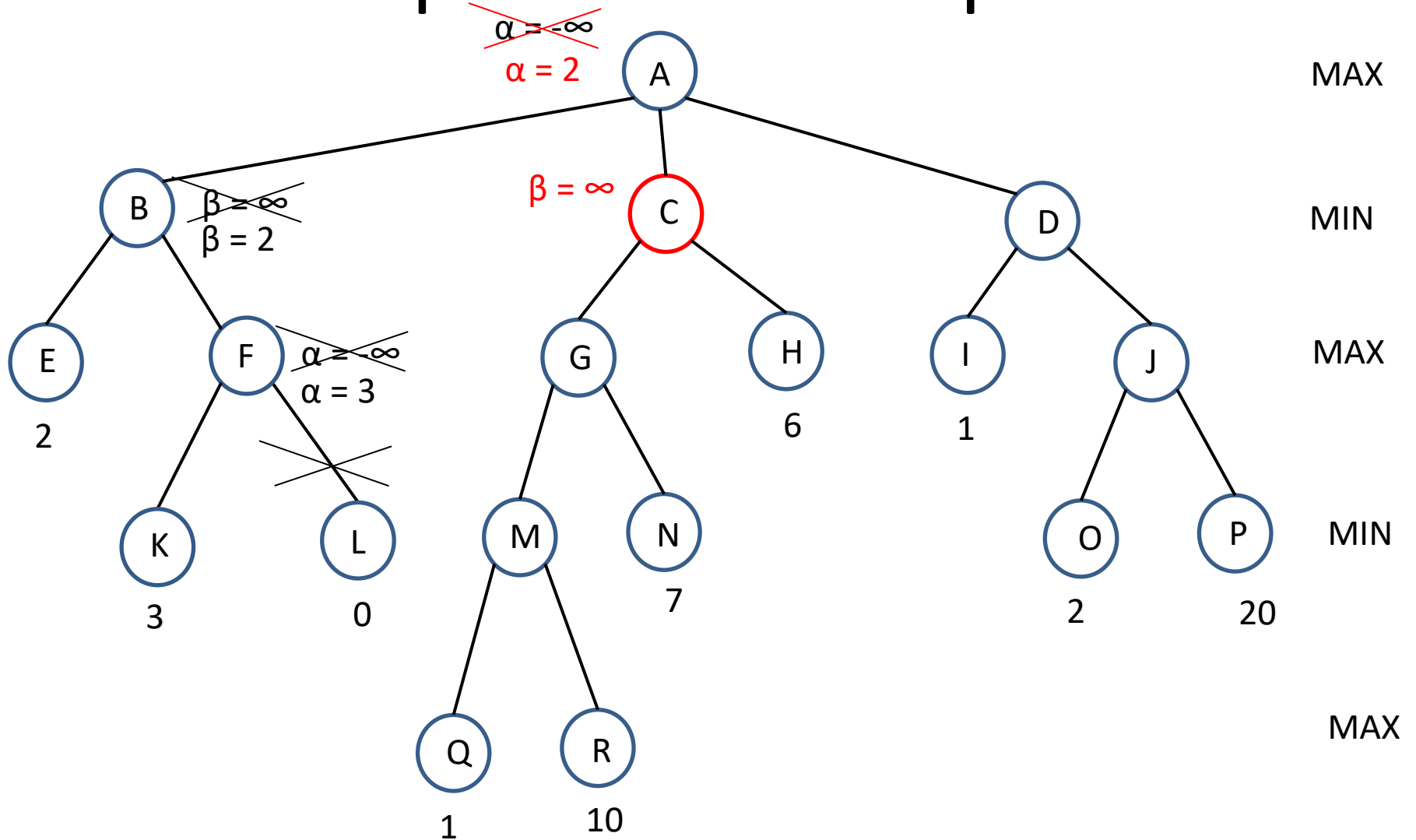
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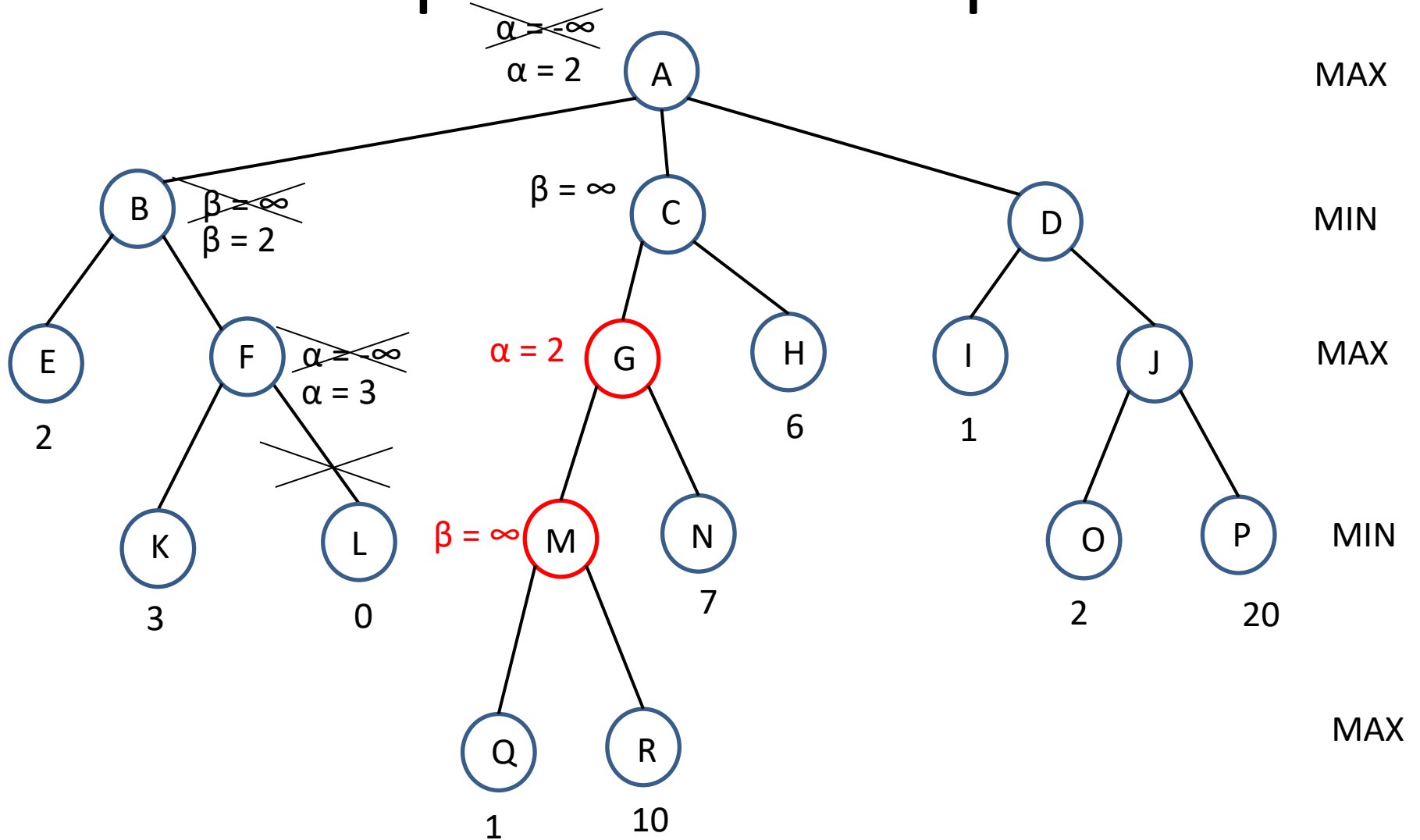
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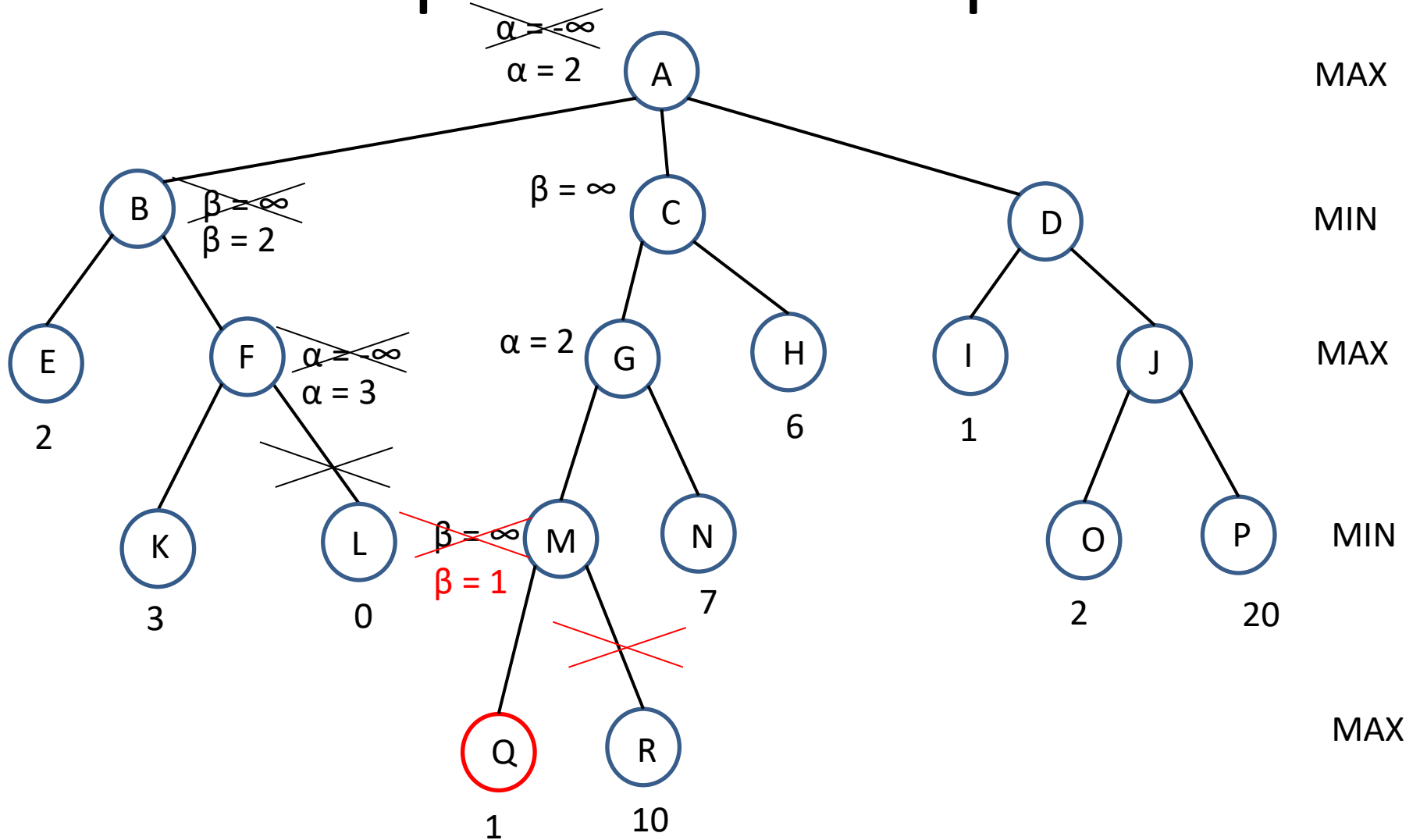
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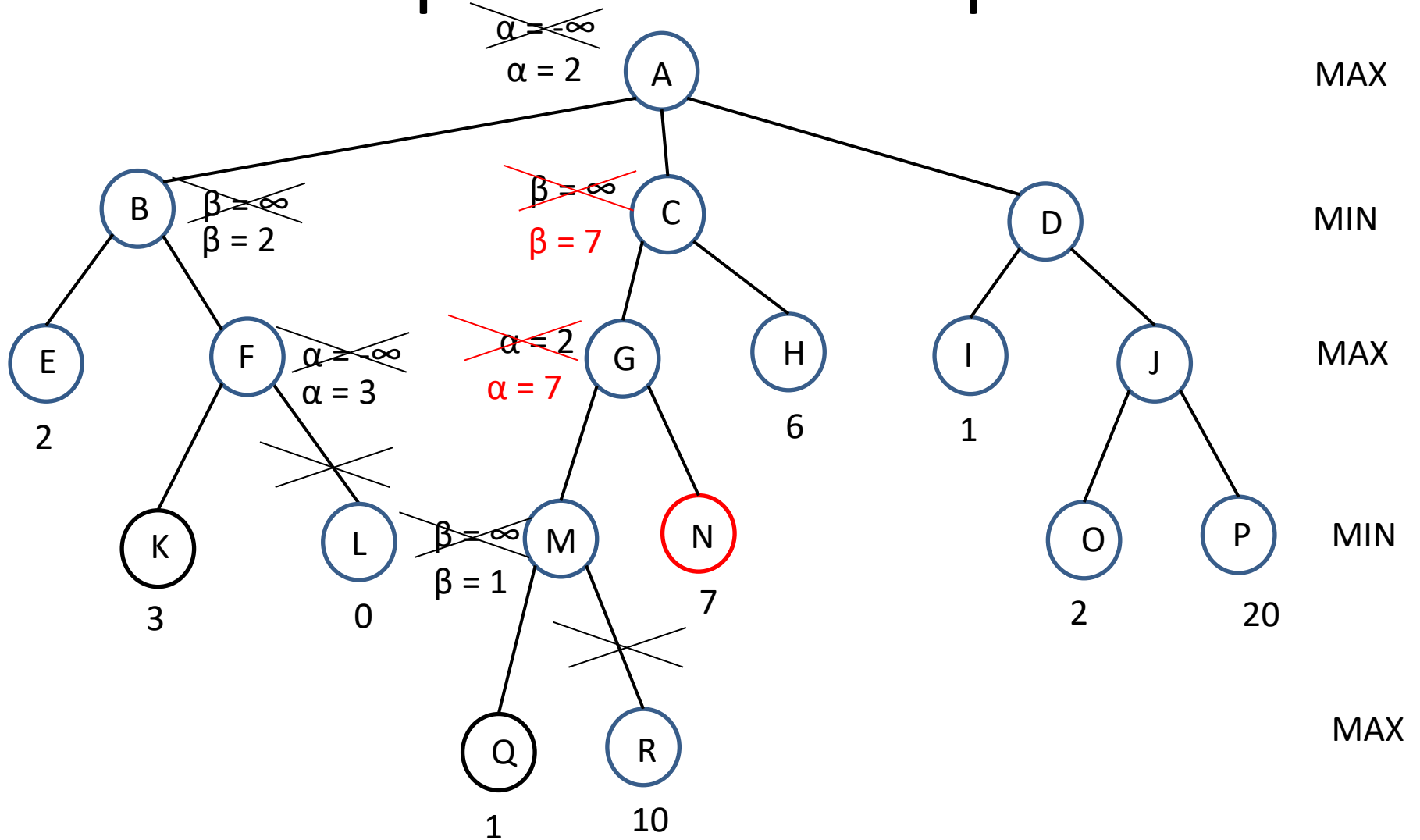
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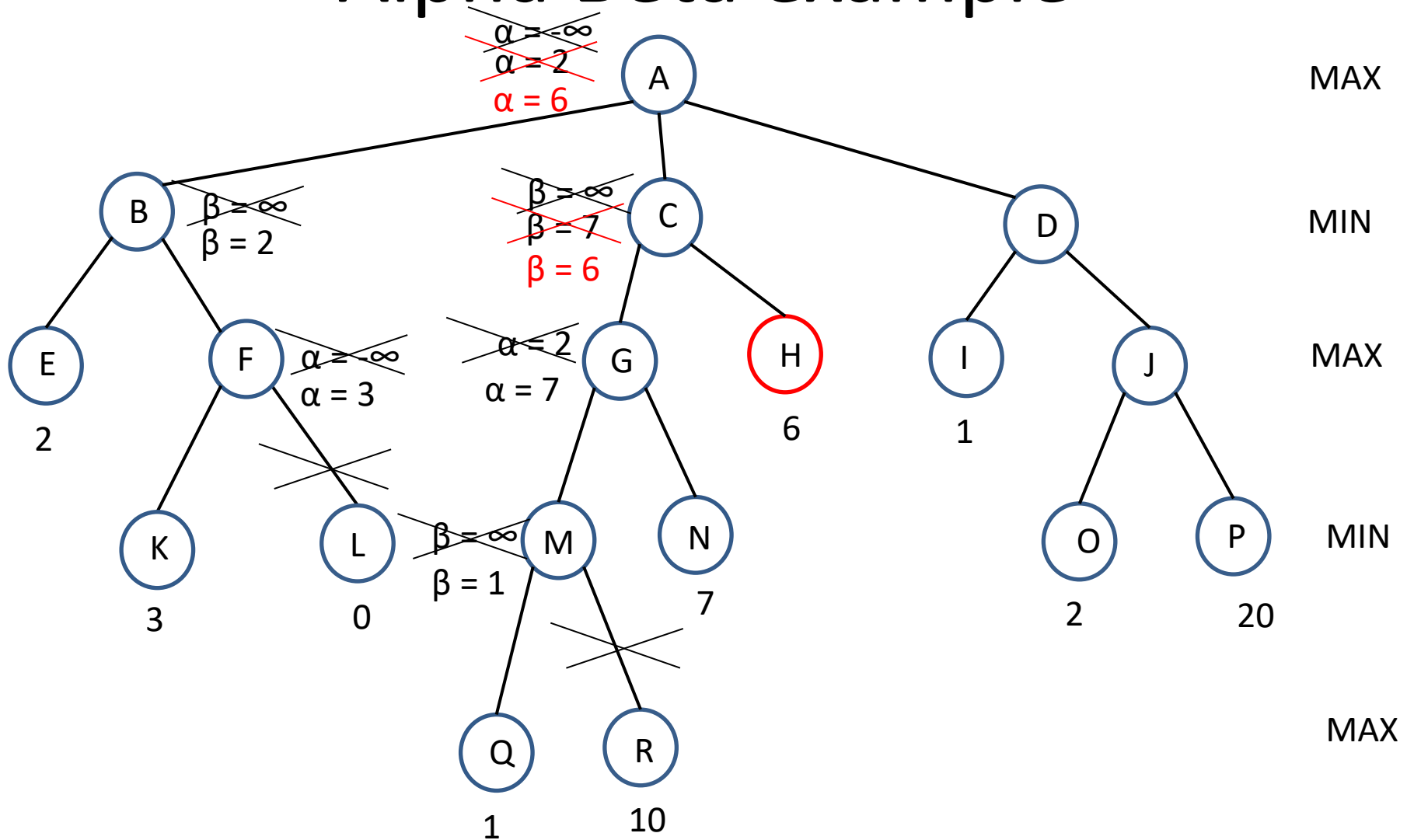
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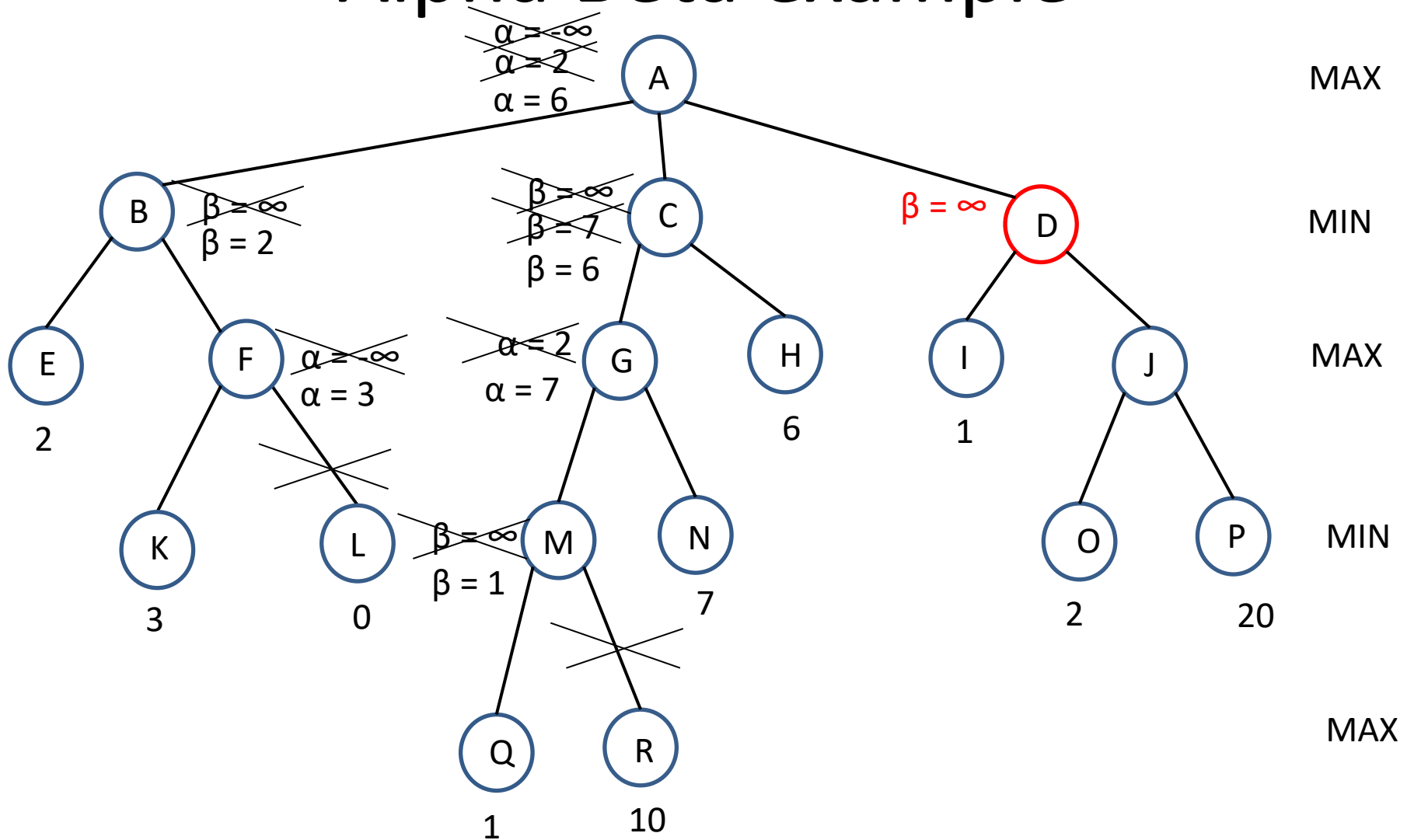
# Alpha Beta example



# Alpha Beta example

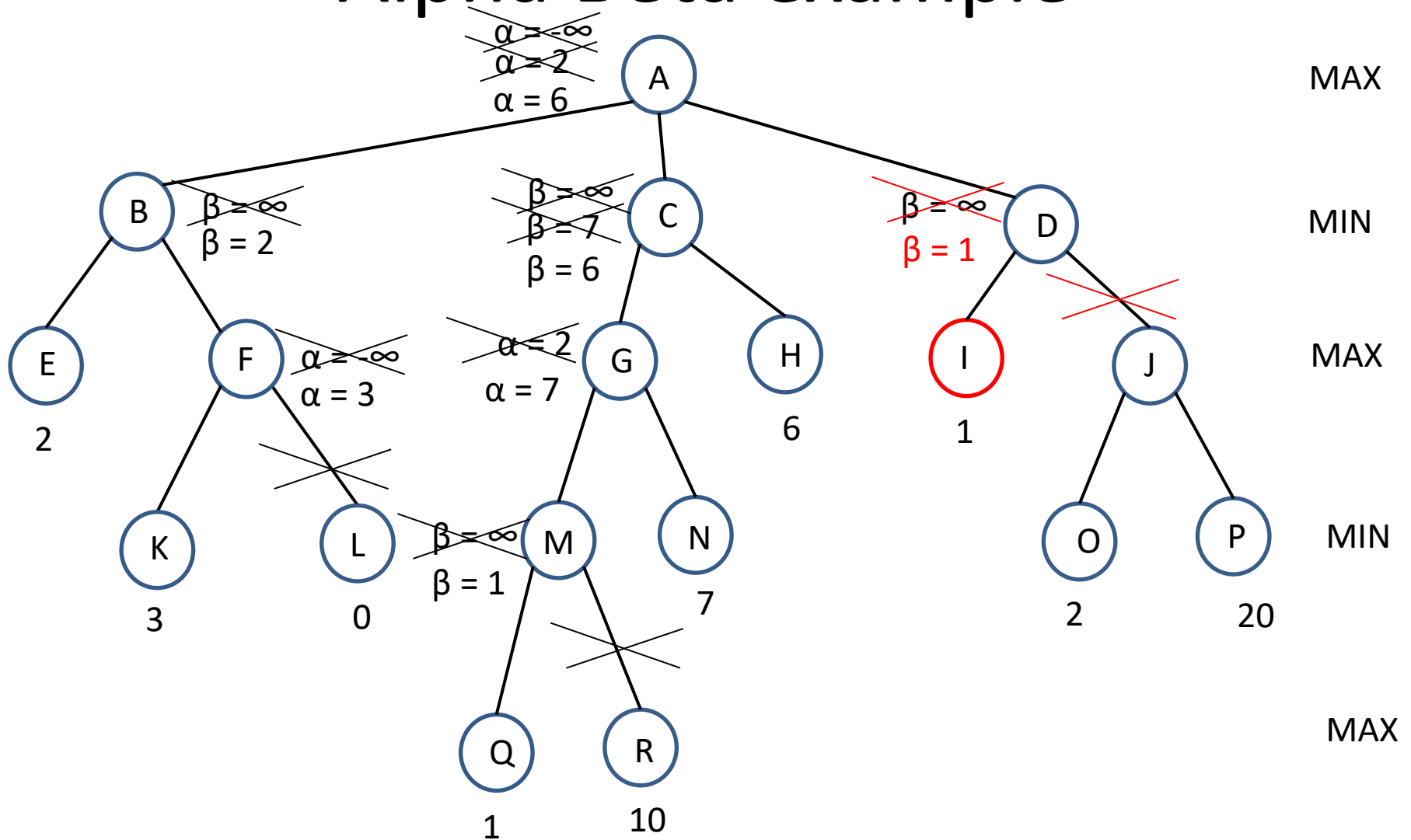


# Alpha Beta example





# Alpha Beta example



List the leaf nodes in the order that they are statically evaluated: E, K, Q, N, H and I

# Related resources

- [http://ocw.mit.edu/courses/electrical-engineering-and-computer-science/6-034-artificial-intelligence-fall-2010/exams/MIT6\\_034F10\\_quiz2\\_2007.pdf](http://ocw.mit.edu/courses/electrical-engineering-and-computer-science/6-034-artificial-intelligence-fall-2010/exams/MIT6_034F10_quiz2_2007.pdf)

# Readings

- Artificial Intelligence (3<sup>rd</sup> Edition), Patrick Winston, Chapter 6