

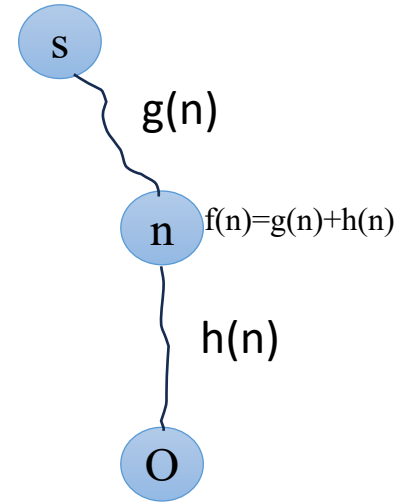
AIFA BEST FIRST SEARCH

16/01/2024

Koustav Rudra

BEST-FIRST Tree Search

- **Initialize:** Set $OPEN = \{s\}$, $CLOSED = \{\}$, $f(s) = h(s)$
- **Fail:**
 - If $OPEN = \{\}$, Terminate with failure
- **Select:** Select the minimum cost state, n , from $OPEN$ and save in $CLOSED$
- **Terminate:**
 - If $n \in G$, terminate with success



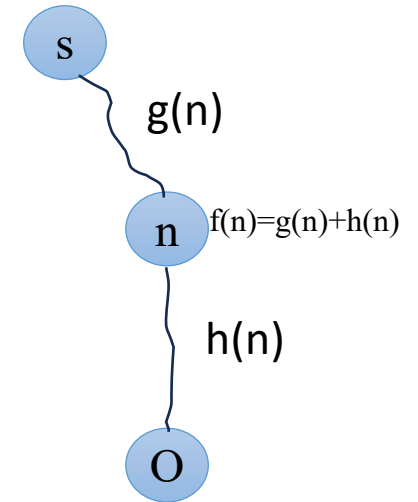
BEST-FIRST Tree Search

- **Expand:**
 - For each successor, m , of n :
 - If $m \notin [OPEN \cup CLOSED]$
 - Set $f(m) = h(m)$
 - Insert m in OPEN
 - If $m \in [OPEN \cup CLOSED]$
 - Set $f(m) = h(m)$
 - If $f(m)$ has decreased and $m \in CLOSED$
 - Move m to OPEN
- **Loop:**
 - Go to step 2

BEST-FIRST Tree Search with pruning

BEST-FIRST Tree Search [pruning]

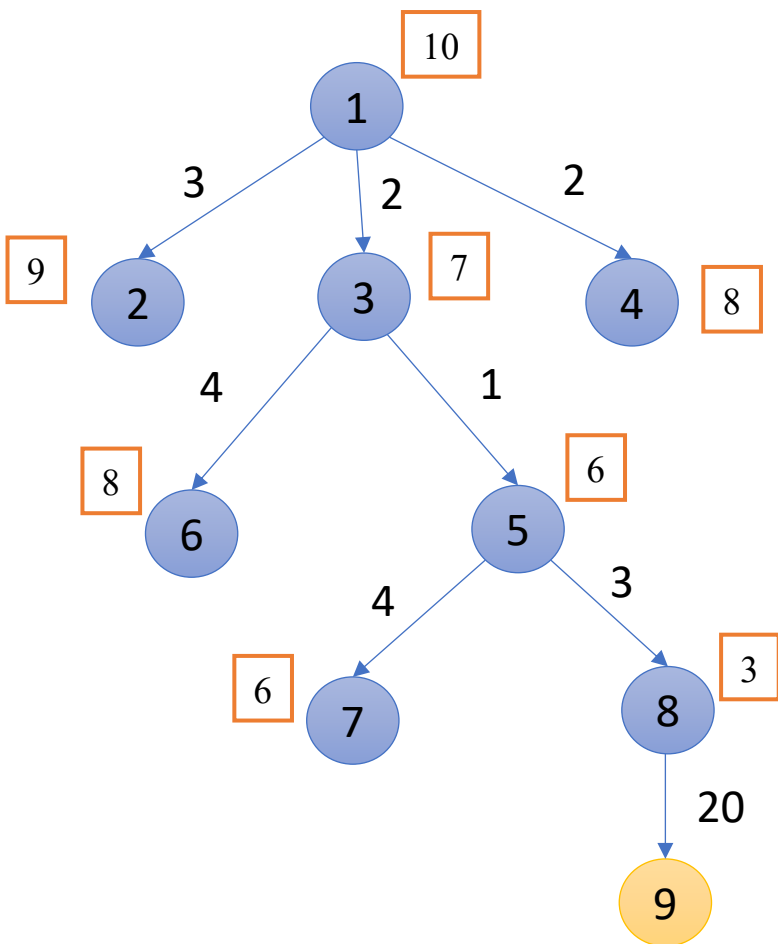
- **Initialize:** Set $OPEN = \{s\}$, $CLOSED = \{\}$, $f(s) = h(s)$, **CB**
- **Fail:**
 - If $OPEN = \{\}$, Terminate with failure
- **Select:** Select the minimum cost state, **n**, from $OPEN$ and save in $CLOSED$
- **Terminate:**
 - If $n \in G$ and $f(n) < CB$, $CB = f(n)$, Go to Step 2
 - Else terminate



BEST-FIRST Tree Search [pruning]

- **Expand:**
 - If $f(n) \leq CB$
 - For each successor, m , of n :
 - If $m \notin [OPEN \cup CLOSED]$
 - Set $f(m) = h(m)$
 - Insert m in OPEN
 - If $m \in [OPEN \cup CLOSED]$
 - Set $f(m) = h(m)$
 - If $f(m)$ has decreased and $m \in CLOSED$
 - Move m to OPEN
 - **Loop:**
 - Go to step 2

BEST-FIRST Tree Search



OPEN SET	SELECT	GOAL	EXPANDED	CLOSED
[1(10)]	1(10)	N	[2(9),3(7),4(8)]	[1(10)]
[2(9),3(7),4(8)]	3(7)	N	[2(9),4(8),6(8),5(6)]	[1(10),3(7)]
[2(9),4(8),6(8),5(6)]	5(6)	N	[2(9),4(8),6(8),7(6),8(3)]	[1(10),3(7),5(6)]
[2(9),4(8),6(8),7(6),8(3)]	8(3)	N	[2(9),4(8),6(8),7(6),6(0)]	[1(10),3(7),5(6),8(3)]
[2(9),4(8),6(8),7(6),9(0)]	9(0)	Y		

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Hill Climbing Algorithm

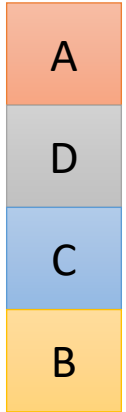
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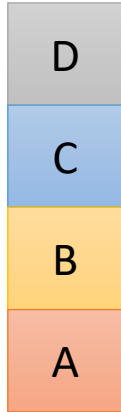
Hill Climbing Algorithm

- Evaluate the INITIAL state
 - If it is GOAL return it
 - Else $CURRENT \leftarrow INITIAL$
- Loop until the solution is found or no new operators could be applied to CURRENT:
 - Select an operator that has not been applied to the current state [CURRENT] and apply it to produce new state [NEW]
 - Evaluate NEW:
 - If it is GOAL return it
 - Else If $NEW > CURRENT$, $CURRENT \leftarrow NEW$
 - Else go to Loop

Hill Climbing Algorithm



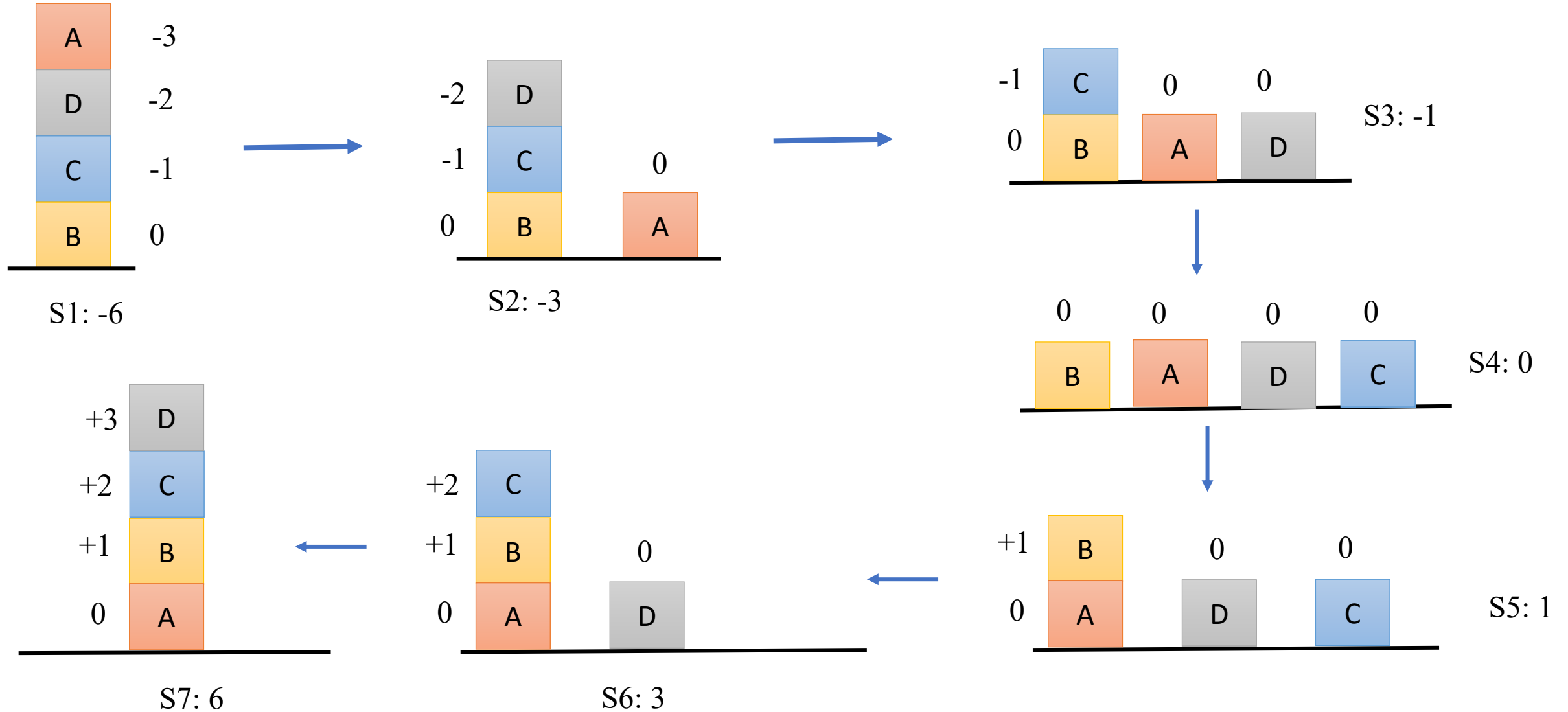
Start



Goal

- $h(x) = +1$ for all the blocks in support structure if the block is positioned correctly
- Otherwise -1 for all the blocks

Hill Climbing Algorithm



Hill Climbing Algorithm: Drawbacks

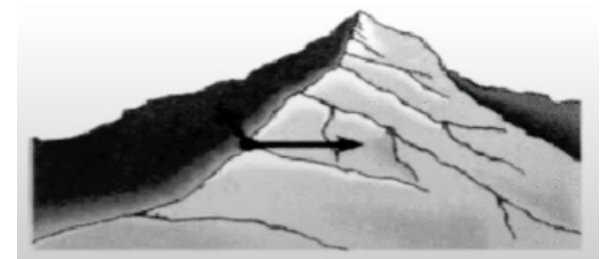
- Local Maxima:
 - A local maxima is supposed to be global maxima



- Plateaus:
 - Area of search space where evaluation function is flat
 - Requiring random walk

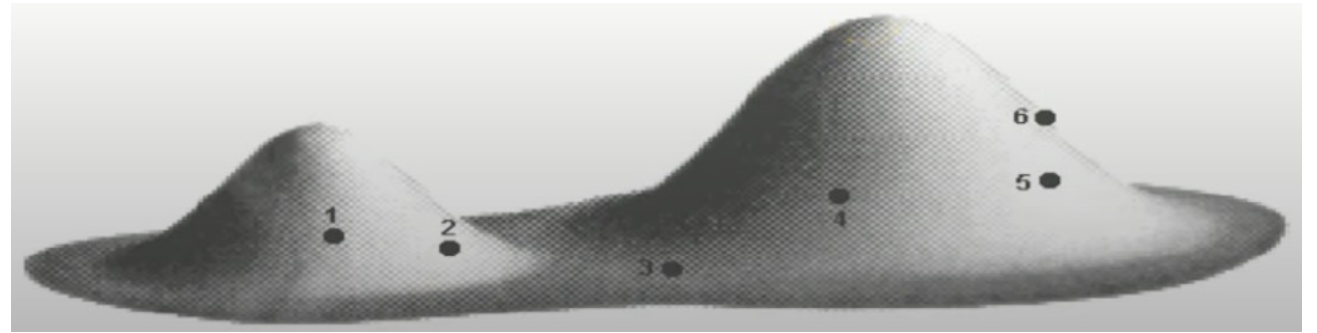


- Ridge:
 - Steep slopes
 - Search direction is not towards the top but towards the side



Drawback: Solution

- In each of the previous cases (local maxima, plateaus, & ridge), the algorithm reaches a point at which no progress is being made

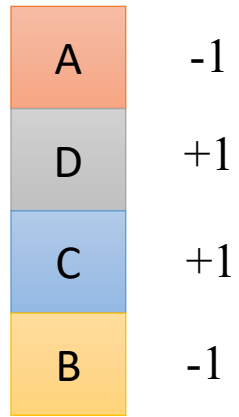


- Solution
 - Random-restart-hill-climbing
 - Random initial states are generated
 - Running each until it halts or makes no discernible progress
 - Best result is chosen

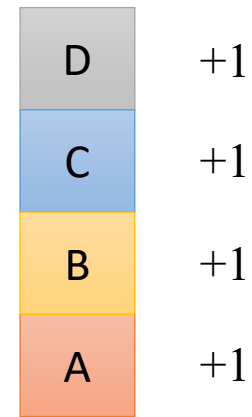
Hill Climbing Algorithm: Disadvantages

- Hill Climbing uses local information:
 - Decides what to do next by looking only at the “immediate” consequences of its choices
 - Will terminate when at local optimum
 - The order of application of operators can make a big difference
- Global information might be encoded in heuristic functions

Hill Climbing Algorithm: Disadvantages



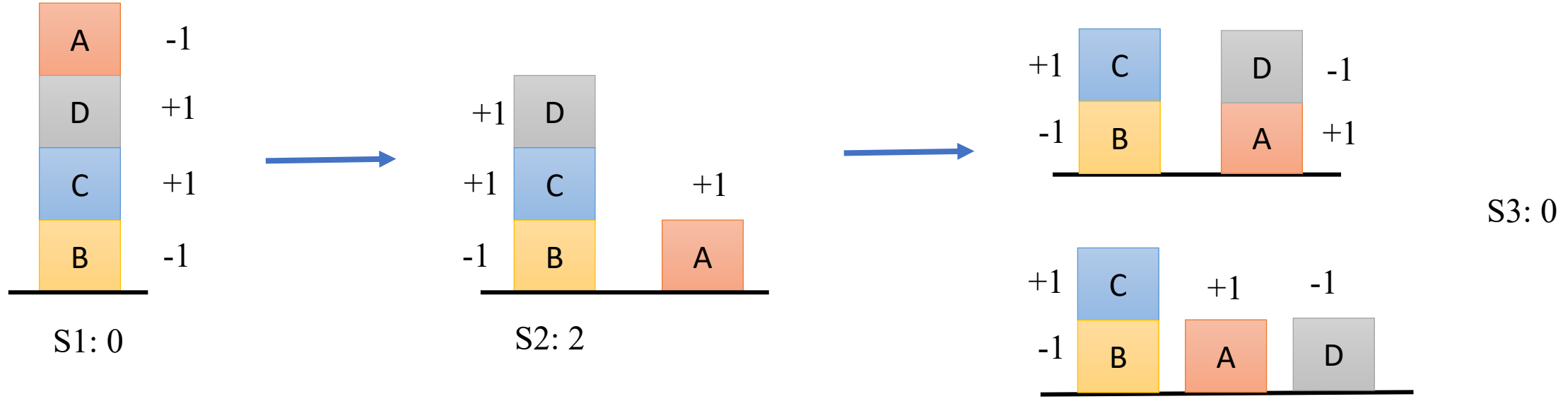
Start 0



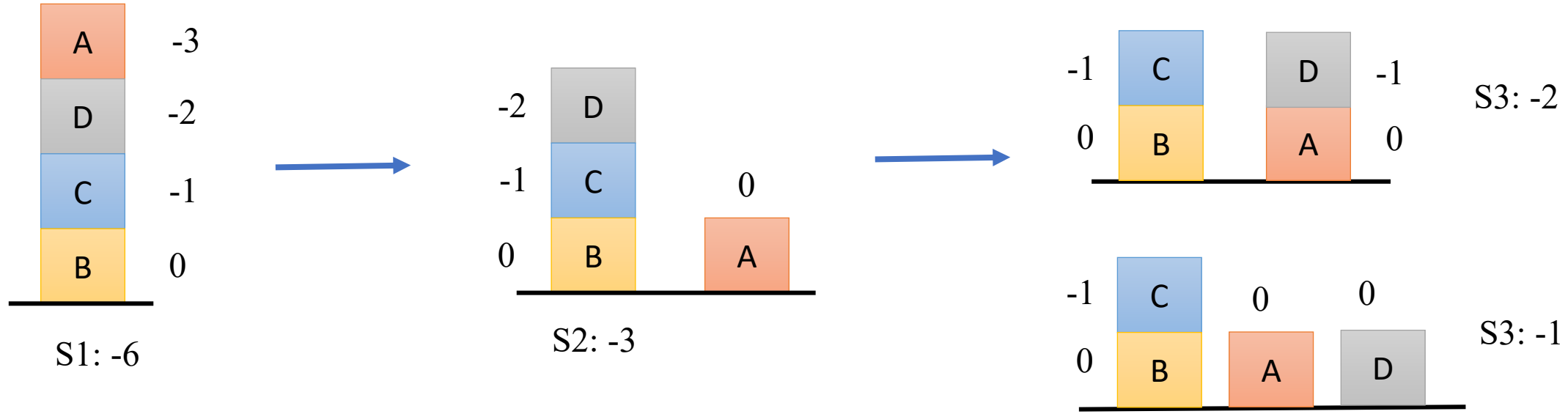
Goal 4

- Local Heuristics
 - +1 for each block that is resting on the thing it is supposed to be resting on
 - -1 for each block that is resting on a wrong thing

Hill Climbing Algorithm: Local Heuristics

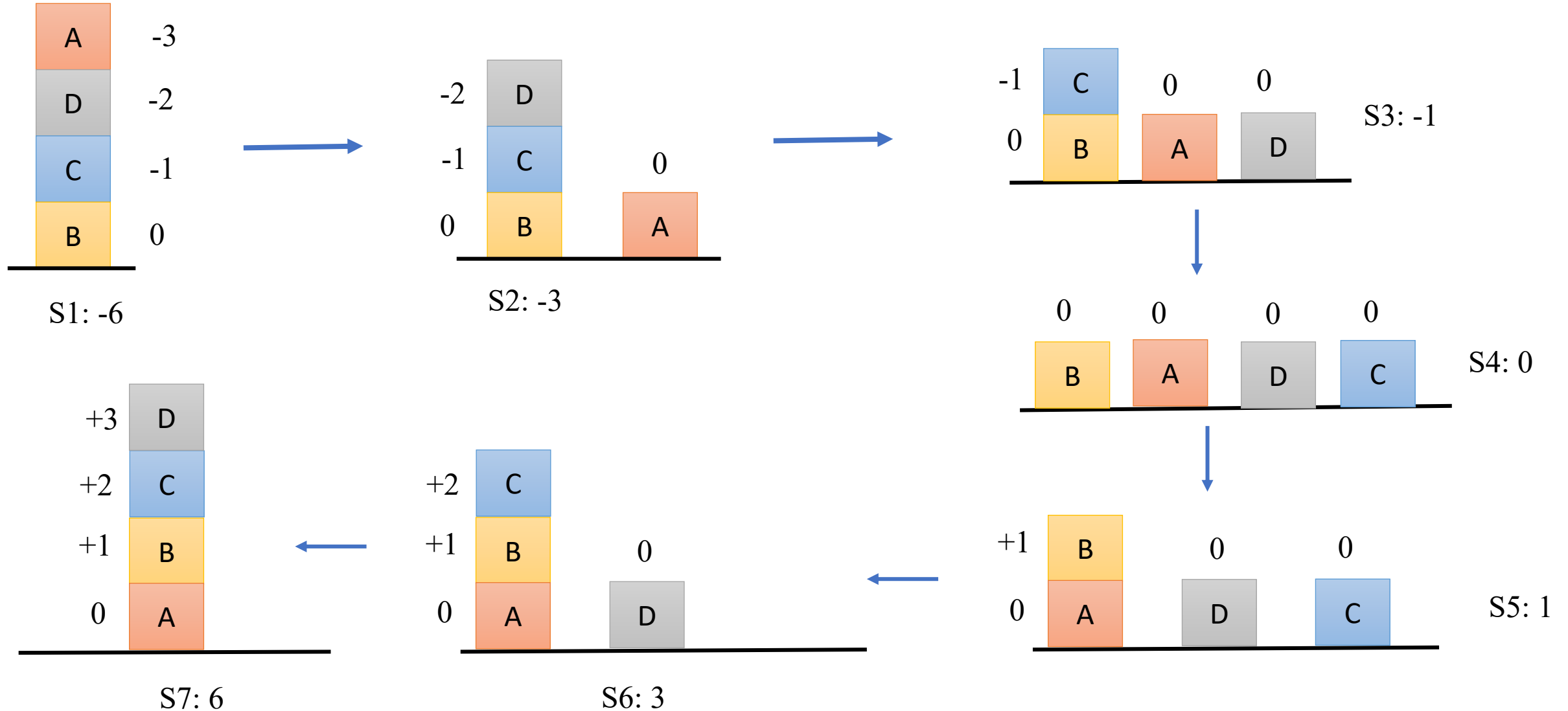


Hill Climbing Algorithm: Global Heuristics



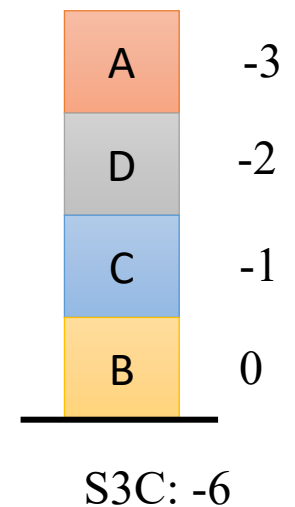
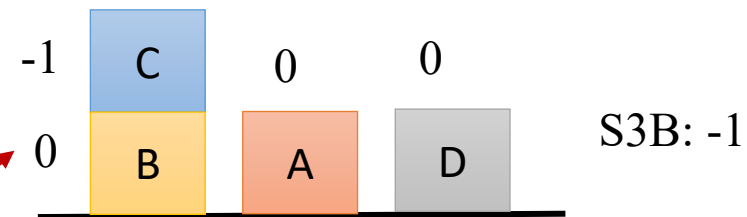
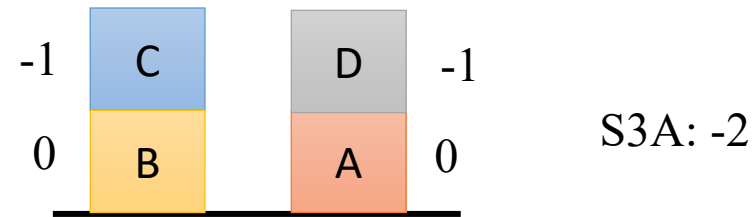
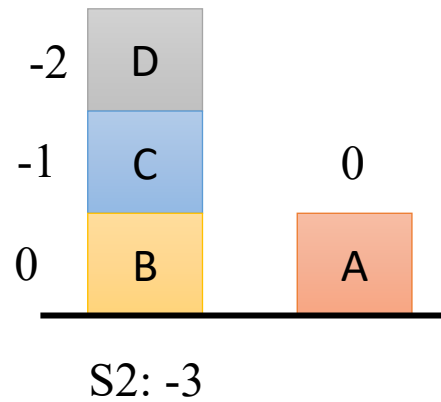
- $h(x) = +1$ for all the blocks in support structure if the block is positioned correctly
- Otherwise -1 for all the blocks
- There is no local maximum
- Takeaway
 - Sometimes changing the heuristic function is all we need

Hill Climbing Algorithm: Global Heuristics



Steepest-Ascent Hill Climbing Algorithm

- Basic Hill Climbing first applies one operator and gets new state
- Steepest-Ascent Hill Climbing considers all the moves from the current state
- Select the best one as next state



Steepest-Ascent Hill Climbing Algorithm

- Evaluate the INITIAL state
 - If it is GOAL return it
 - Else $CURRENT \leftarrow INITIAL$
- Loop until the solution is found or until a complete iteration produces no change to CURRENT:
 - Let SUCC be a state such that any possible successor of the current state will be better than SUCC
 - For each operator that applies to the current state [CURRENT] do
 - Apply the operator and generate a new state [NEW]
 - Evaluate NEW:
 - If it is GOAL return it and quit
 - Else If $NEW > SUCC$, $SUCC \leftarrow NEW$
 - If $SUCC > CURRENT$
 - $CURRENT \leftarrow SUCC$

Search with Limited Memory and Time

- Mechanisms for discarding nodes
 - Pruning
 - DFBB
 - Memory Bound A*
- Mechanisms for redoing nodes
 - IDA*
- Domain relaxation – What is the utility?

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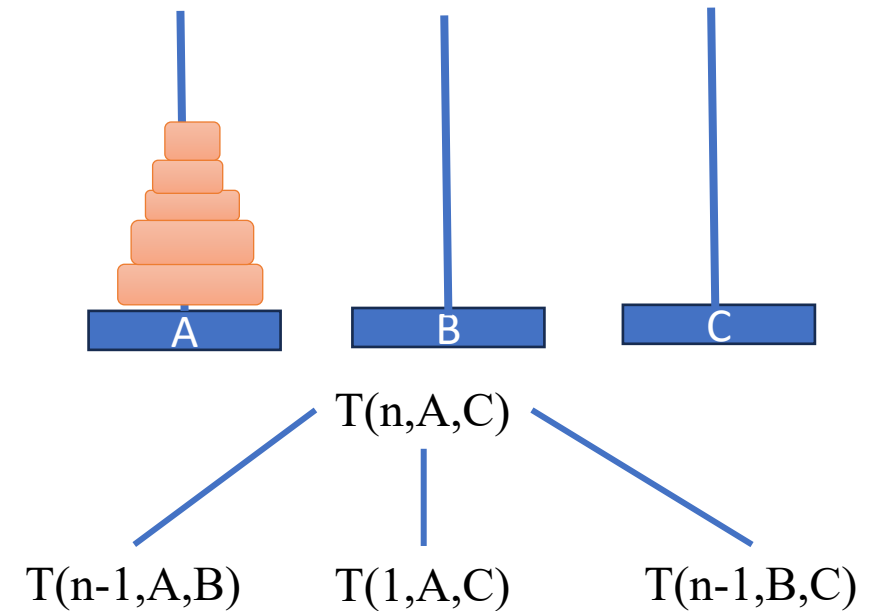
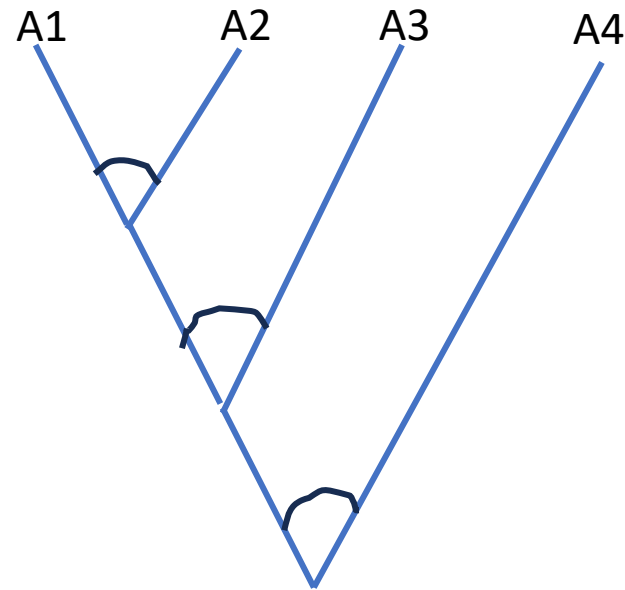
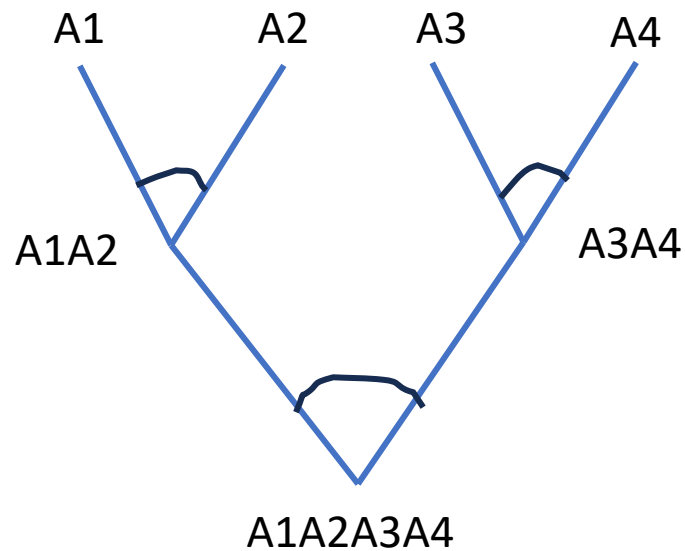
Problem Reduction Search

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Problem Reduction Search

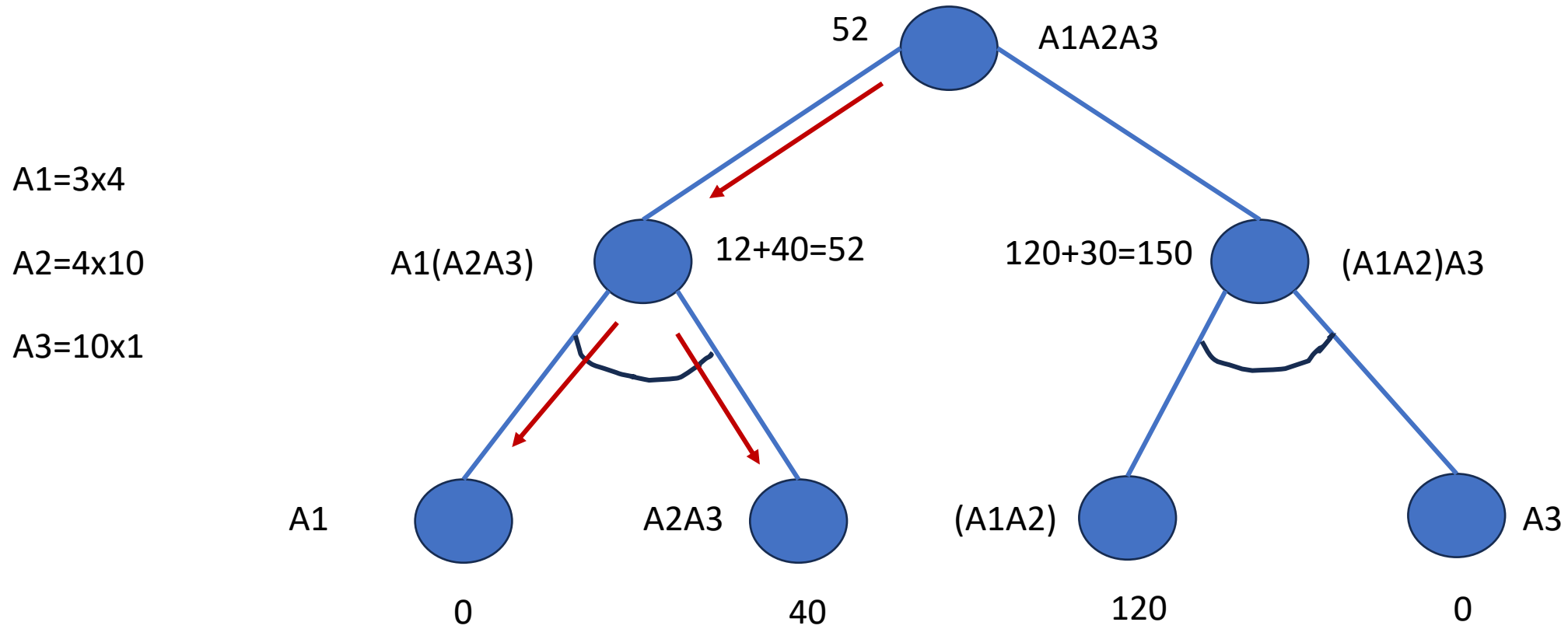
- Planning how best to solve a problem that can be recursively decomposed into sub-problems in multiple ways
 - Matrix multiplication problem
 - Tower of Hanoi
 - Theorem proving



Formulation

- AND/OR Graph
 - An OR node represents a choice between possible decompositions
 - An AND node represents a given decomposition
- Game Trees
 - Max/Min nodes
 - Max nodes represent the choice of my opponent
 - Min nodes represent my choice

Each node has a separate optimization criteria



- This is when heuristics is not present

Thank You