

Artificial Intelligence

DT8012

Uninformed search
Chapter 3, AIMA

A "problem" consists of

- An initial state, $\theta(0)$
- A list of possible actions, α , for the agent
- A goal test (there can be many goal states)
- A path cost

One way to solve this is to search for a path

$$\theta(0) \rightarrow \theta(1) \rightarrow \theta(2) \rightarrow \dots \rightarrow \theta(N)$$

such that $\theta(N)$ is a goal state.

Example: 8-puzzle

7	2	4
5		6
8	3	1

Start State

	1	2
3	4	5
6	7	8

Goal State

2	8	3
1	6	4
7		5

Start State

1	2	3
8		4
7	6	5

Goal State

- **State:** Specification of each of the eight tiles in the nine squares (the blank is in the remaining square).
- **Initial state:** Any state.
- **Successor function (actions):** Blank moves *Left*, *Right*, *Up*, or *Down*.
- **Goal test:** Check whether the goal state has been reached.
- **Path cost:** Each move costs 1. The path cost = the number of moves.

Example: 8-puzzle

7	2	4
5		6
8	3	1

Start State

	1	2
3	4	5
6	7	8

Goal State

- **State:** Specification of each of the eight tiles in the nine squares (the blank is in the remaining square).

Examples:

$$\theta = \{7, 2, 4, 5, 0, 6, 8, 3, 1\}$$

$$\theta = \{2, 8, 3, 1, 6, 4, 7, 0, 5\}$$

2	8	3
1	6	4
7		5

Start State

1	2	3
8		4
7	6	5

Goal State

Example: 8-puzzle

7	2	4
5		6
8	3	1

Start State

	1	2
3	4	5
6	7	8

Goal State

- **Successor function (actions):** Blank moves *Left*, *Right*, *Up*, or *Down*.

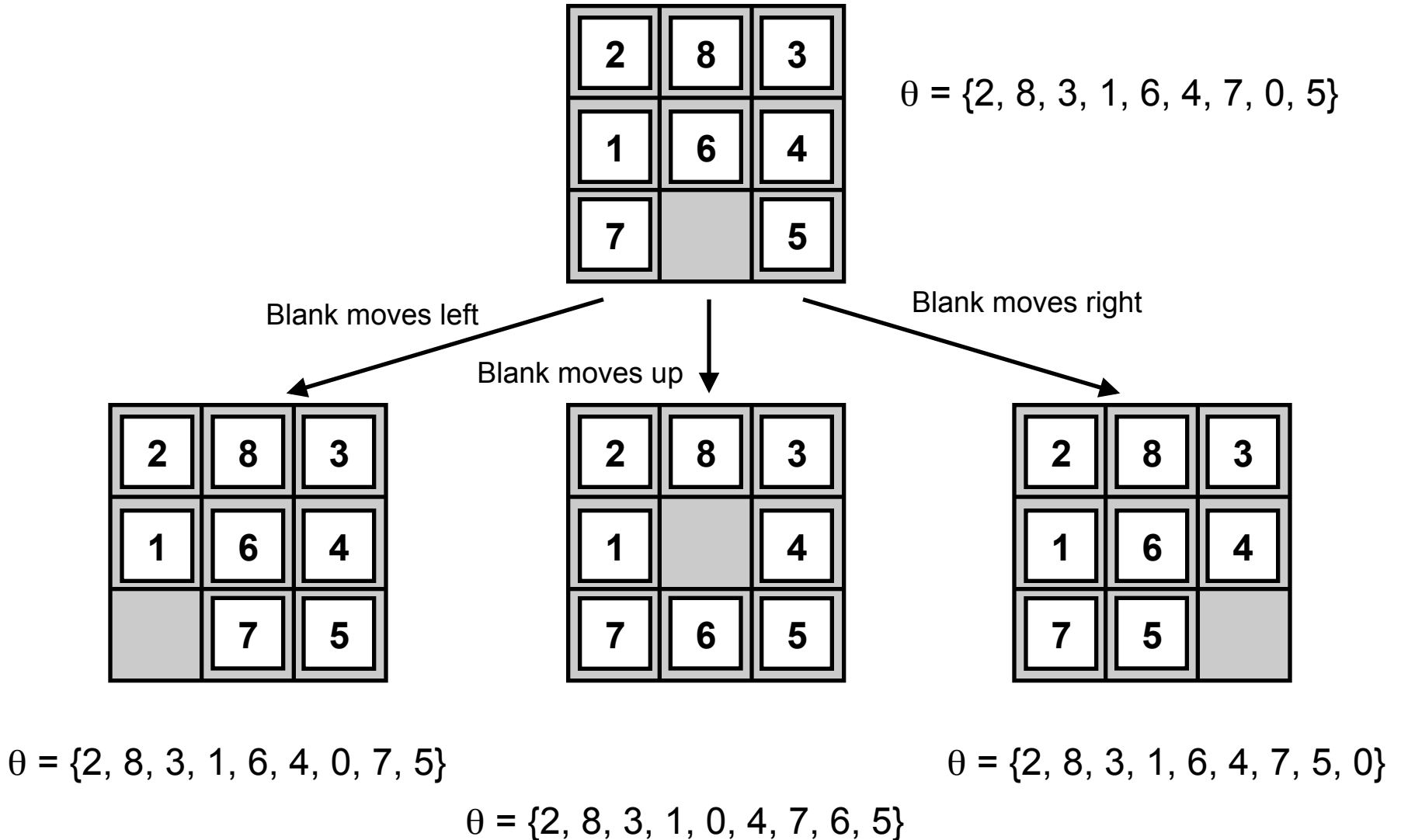
2	8	3
1	6	4
7		5

Start State

1	2	3
8		4
7	6	5

Goal State

Expanding 8-puzzle



Uninformed search

Searching for the goal without knowing in which direction it is.

- Breadth-first
- Depth-first
- Iterative deepening

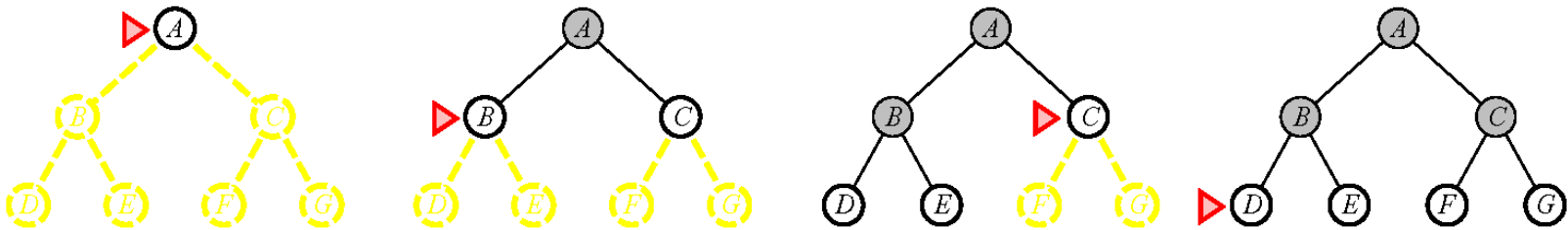
(Depth and breadth refers to the search tree)

We evaluate the algorithms by their:

- Completeness (do they explore all possibilities)
- Optimality (do they find the solution with minimum path cost)
- Time complexity (number of nodes expanded during search)
- Space complexity (maximum number of nodes in memory)

Breadth-first

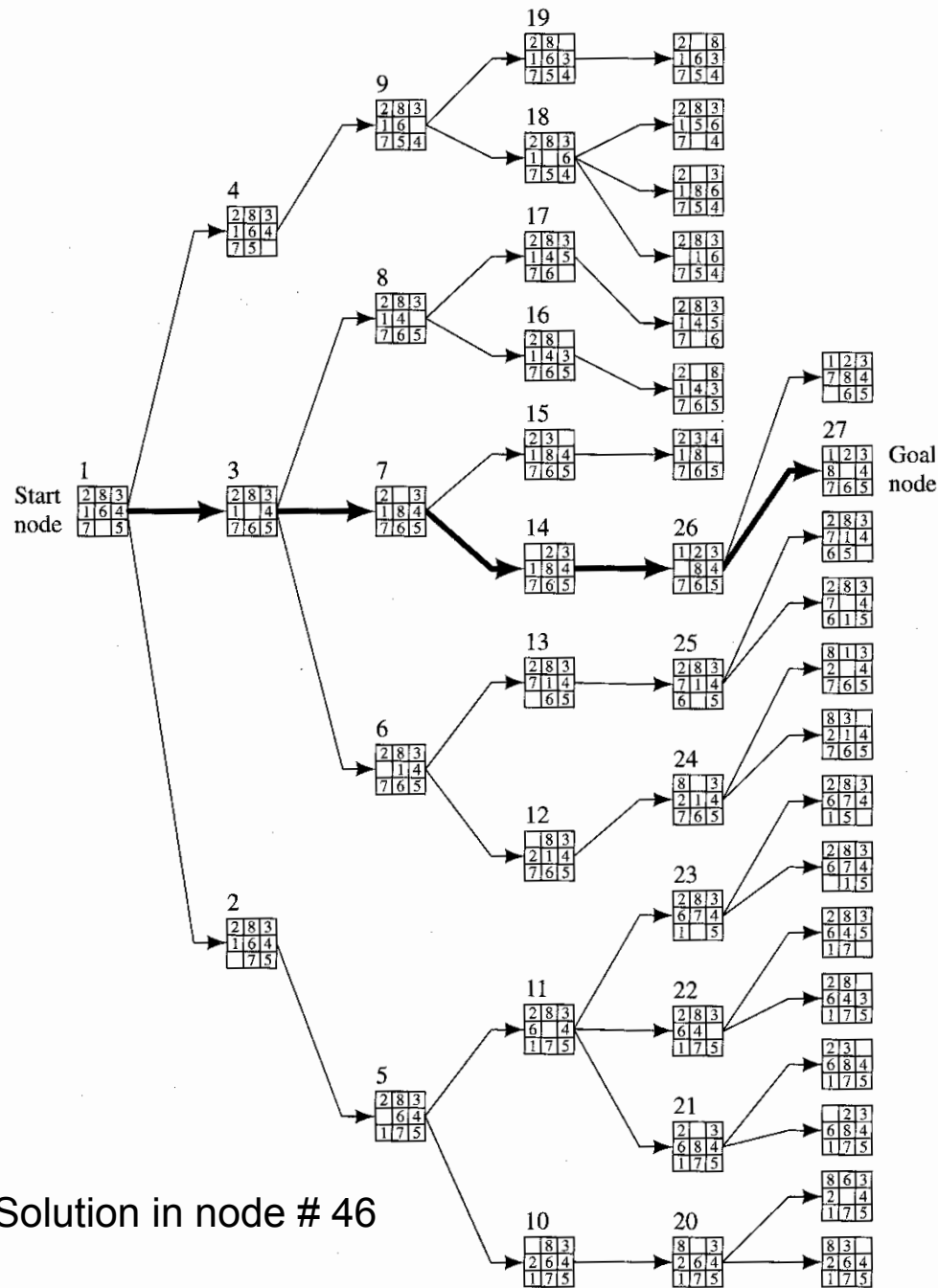
Image from Russel & Norvig, AIMA, 2003



Nodes marked with open circles = fringe = in the memory

- Breadth-first finds the solution that is closest (in the graph) to the start node (always expands the shallowest node).
- Keeps $O(b^d)$ nodes in memory \rightarrow exponential memory requirement!
- Complete (finds a solution if there is one)
- Not necessarily optimal (optimal if cost is the same for each step)
- Exponential space complexity (very bad)
- Exponential time complexity

b = branching factor, d = depth



Breadth-first search for 8-puzzle.

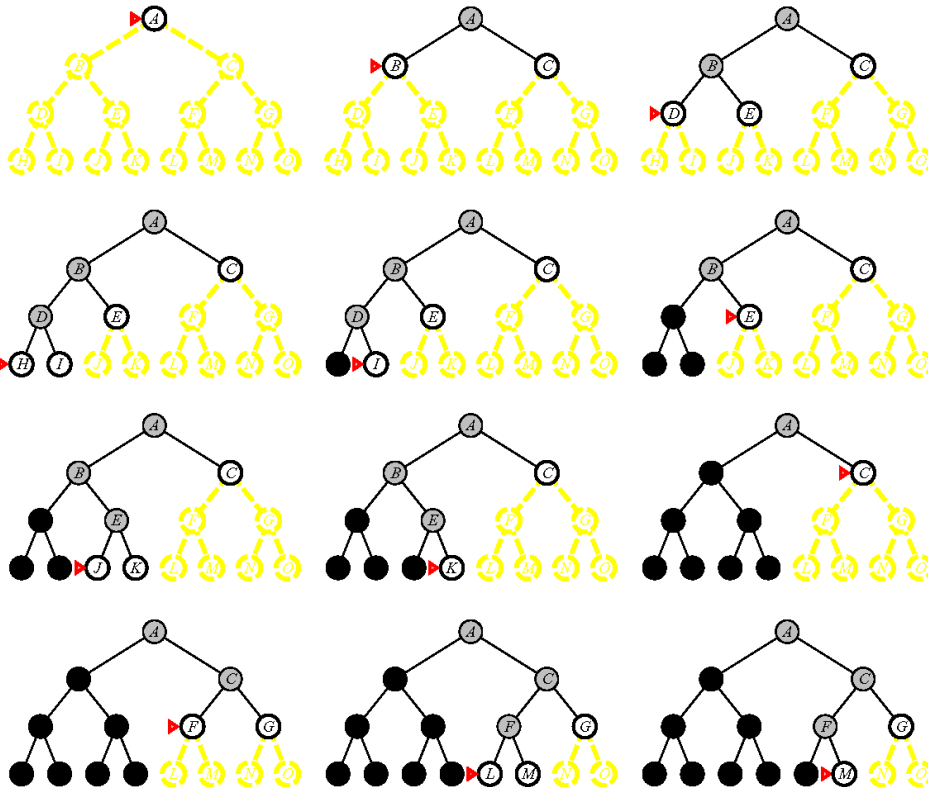
The path marked by bold arrows is the solution.

Note: This assumes that you apply goal test immediately after expansion (not the case for AIMA implementation)

If we keep track of visited states → *Graph search* (rather than *tree search*)

Depth-first

Image from Russel & Norvig, AIMA, 2003



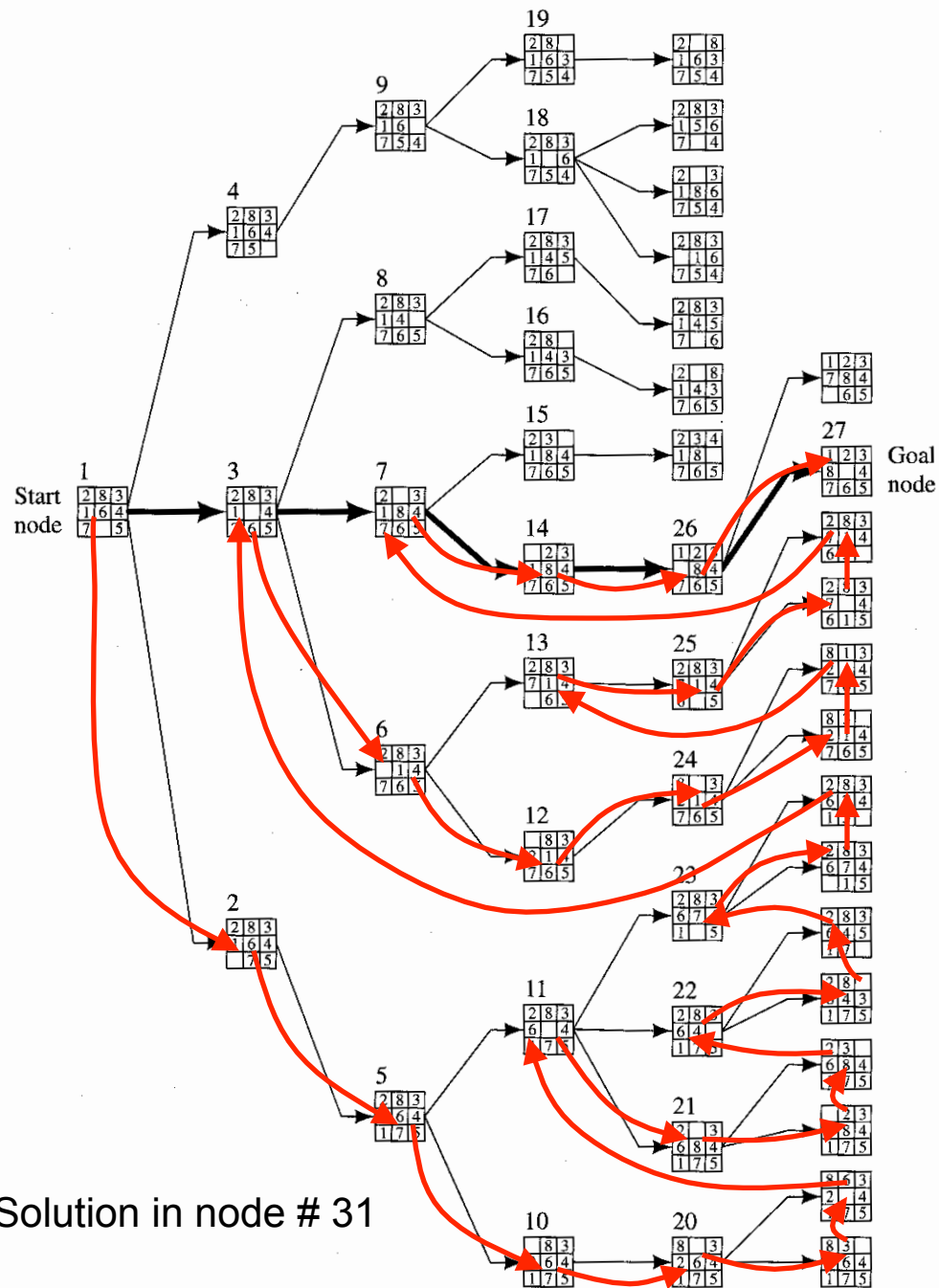
Black nodes are removed from memory

b = branching factor, d = depth

- Keeps $O(bd)$ nodes in memory.
- Requires a depth limit to avoid infinite paths (limit is 3 in the figure).
- Incomplete (is not guaranteed to find a solution)
- Not optimal
- Linear space complexity (good)
- Exponential time complexity

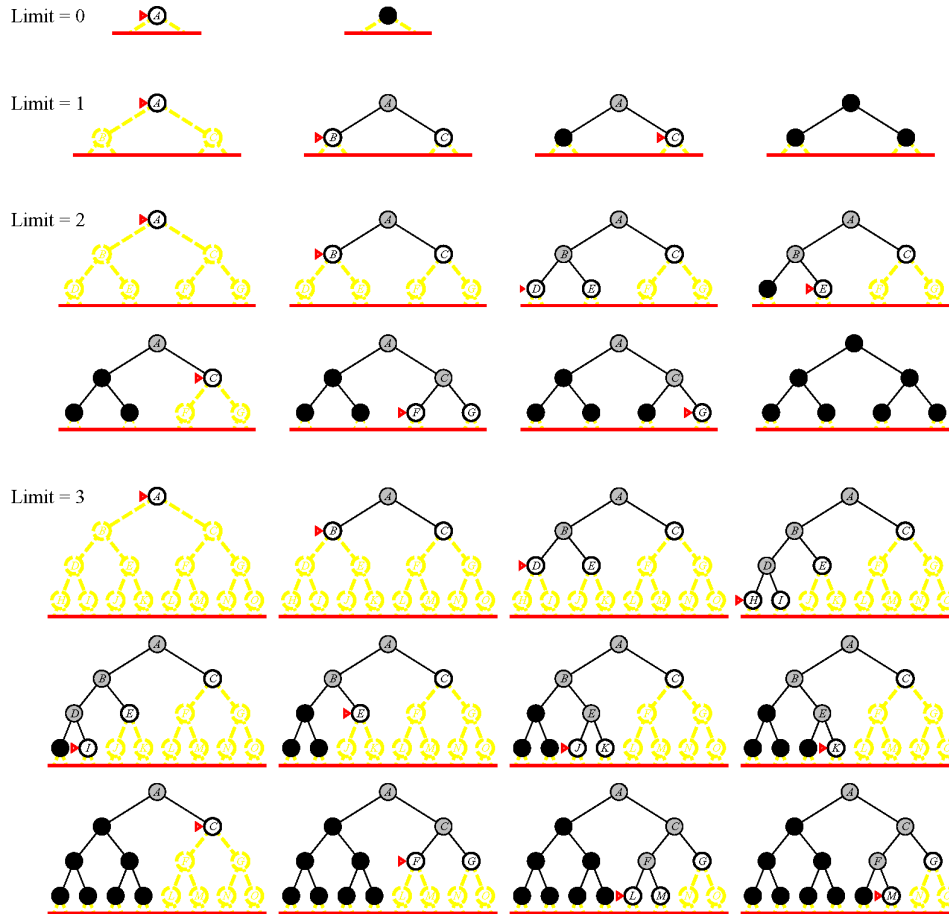
Depth-first on the 8-puzzle example.

Depth = 5



Iterative deepening

Image from Russel & Norvig, AIMA, 2003



Black nodes are removed from memory

- Keeps $O(bd)$ nodes in memory.
- Iteratively increases the depth limit.
- Complete (like BFS)
- Optimal (if step costs are same)
- Linear space complexity (like DFS)
- Exponential time complexity
- The preferred search method for large search spaces with unknown depth.

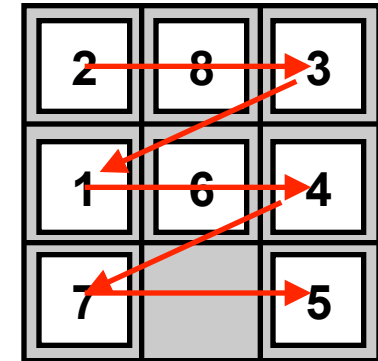
b = branching factor, d = depth

Exercise

Exercise 3.4: Show that the 8-puzzle states are divided into two disjoint sets, such that no state in one set can be transformed into a state in the other set by any number of moves. Devise a procedure that will tell you which class a given state is in, and explain why this is a good thing to have for generating random states.

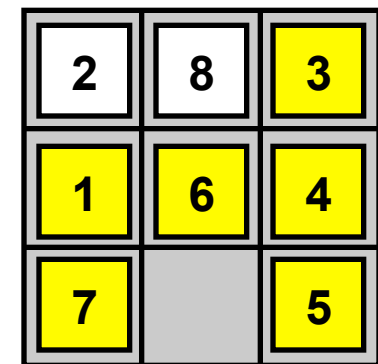
Proof for exercise 3.4:

Definition: Define the order of counting from the upper left corner to the lower right corner (see figure).

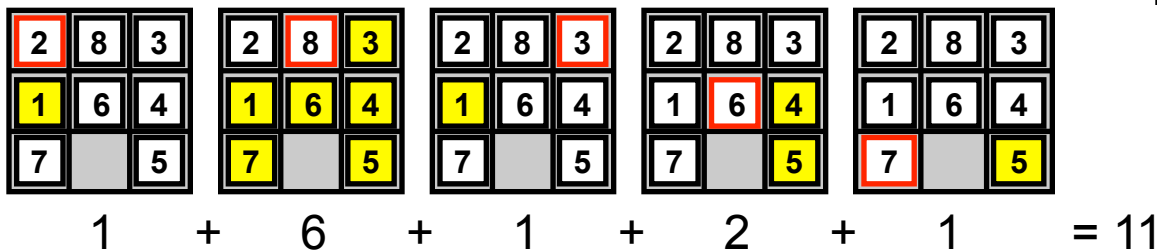


Let N denote the number of lower numbers following a number (so-called "inversions") when counting in this fashion.

$N = 11$ in the figure.



Yellow tiles are inverted relative to the tile with "8" in the top row.



Proof for exercise 3.4:

Proposition: N is either always even or odd
(i.e. $N \bmod 2$ is conserved).

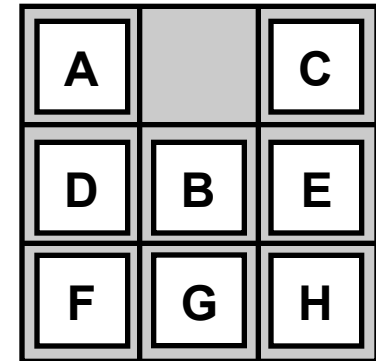
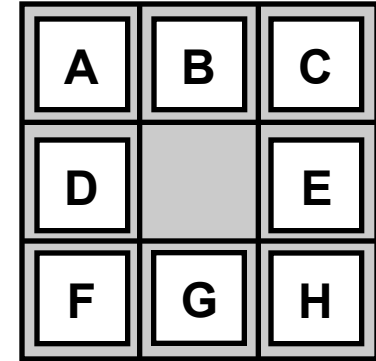
Proof:

- (1) Sliding the blank along a row does not change the row number and not the internal order of the tiles, i.e. N (and thus also $N \bmod 2$) is conserved.
- (2) Sliding the blank between rows does not change $N \bmod 2$ either, as shown on the following slide.

Proof for exercise 3.4:

We only need to consider tiles B, C, and D since the relative order of the other tiles remains the same.

- If $B > C$ and $B > D$, then the move removes two inversions.
- If $B > C$ and $B < D$, then the move adds one inversion and removes one (sum = 0).
- If $B < C$ and $B < D$, then the move adds two inversions.



The number of inversions changes in steps of 2.

Observation

The upper state has $N = 0$

1	2	3
4	5	6
7	8	

The lower (goal) state has $N = 7$

1	2	3
8		4
7	6	5

We cannot go from one to the other.

Exercise

Exercise 3.9: The **missionaries and cannibals**: Three missionaries and three cannibals are on one side of a river, along with a boat that can hold one or two people (one for rowing). Find a way to get everyone to the other side, without ever leaving a group of missionaries in one place outnumbered by the cannibals in that place (the cannibals eat the missionaries then).

- Formulate the problem precisely, making only those distinctions necessary to ensure a valid solution. Draw a diagram of the complete state space.
- Implement and solve the problem optimally using an appropriate search algorithm. Is it a good idea to check for repeated states?
- Why do you think people have a hard time solving this puzzle, given that the state space is so simple?

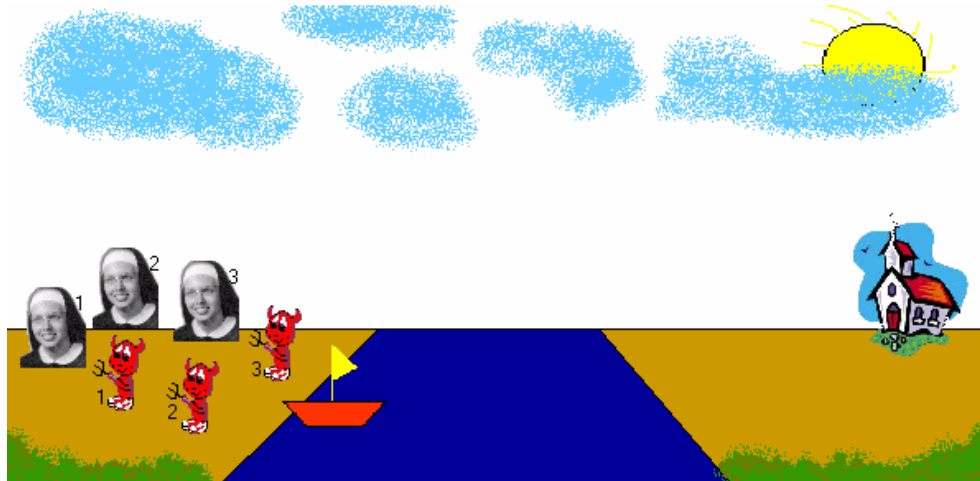


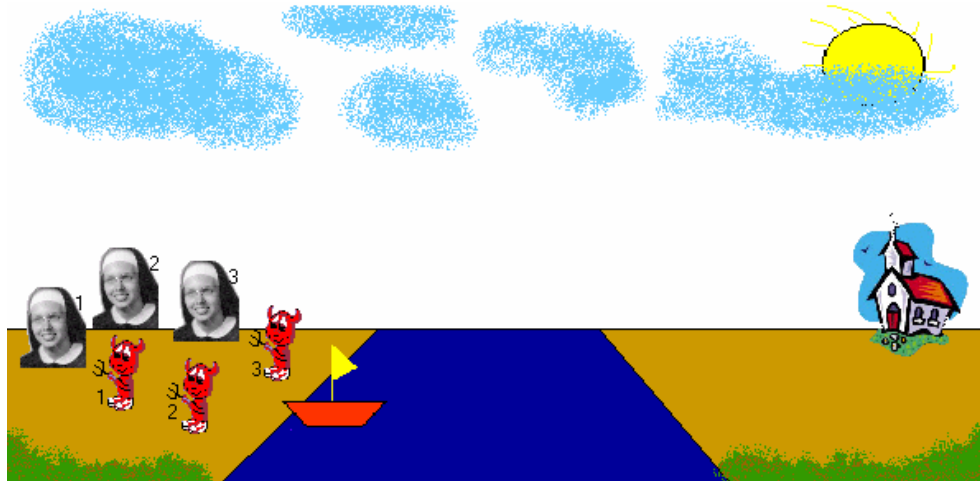
Image from <http://www.cse.msu.edu/~michmer3/440/Lab1/cannibal.html>

Missionaries & Cannibals

State: $\theta = (M,C,B)$ signifying the number of missionaries, cannibals, and boats on the left bank. The **start state is (3,3,1)** and the **goal state is (0,0,0)**.

Actions (successor function): (10 possible but only 5 available each move due to boat)

- One cannibal/missionary crossing $L \rightarrow R$: subtract (0,1,1) or (1,0,1)
- Two cannibals/missionaries crossing $L \rightarrow R$: subtract (0,2,1) or (2,0,1)
- One cannibal/missionary crossing $R \rightarrow L$: add (1,0,1) or (0,1,1)
- Two cannibals/missionaries crossing $R \rightarrow L$: add (2,0,1) or (0,2,1)
- One cannibal and one missionary crossing: add/subtract (1,1,1)



Missionaries & Cannibals states

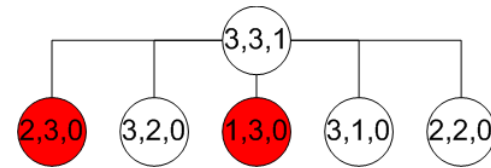


Assumes that passengers have to get out of the boat after the trip.

Red states = missionaries get eaten.

Breadth-first search on Missionaries & Cannibals

Breadth-first search on Missionaries & Cannibals



States are generated by applying:

+/- (1,0,1)

+/- (0,1,1)

+/- (2,0,1)

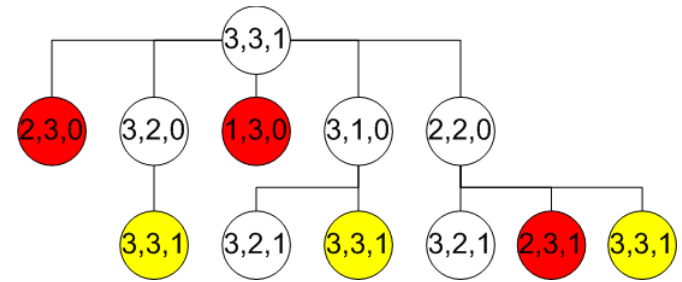
+/- (0,2,1)

+/- (1,1,1)

In that order (left to right)

Red states = missionaries get eaten

Breadth-first search on Missionaries & Cannibals



States are generated by applying:

+/- (1,0,1)

+/- (0,1,1)

+/- (2,0,1)

+/- (0,2,1)

+/- (1,1,1)

In that order (left to right)

Red states = missionaries get eaten

Yellow states = repeated states

Breadth-first search on Missionaries & Cannibals

States are generated by applying:

+/- (1,0,1)

+/- (0,1,1)

+/- (2,0,1)

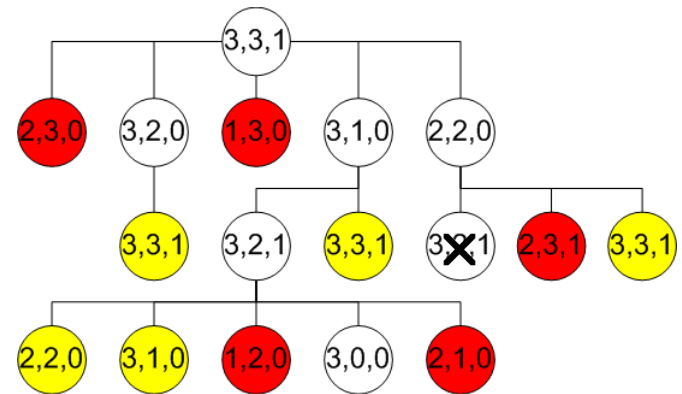
+/- (0,2,1)

+/- (1,1,1)

In that order (left to right)

Red states = missionaries get eaten

Yellow states = repeated states



Breadth-first search on Missionaries & Cannibals

States are generated by applying:

+/- (1,0,1)

+/- (0,1,1)

+/- (2,0,1)

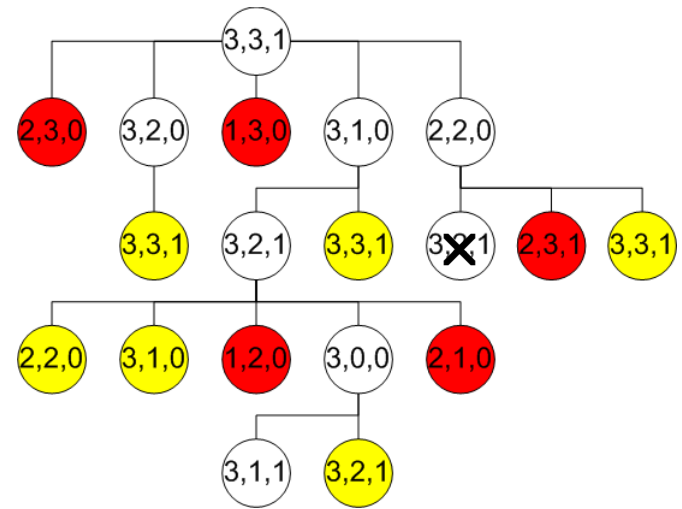
+/- (0,2,1)

+/- (1,1,1)

In that order (left to right)

Red states = missionaries get eaten

Yellow states = repeated states



Breadth-first search on Missionaries & Cannibals

States are generated by applying:

+/- (1,0,1)

+/- (0,1,1)

+/- (2,0,1)

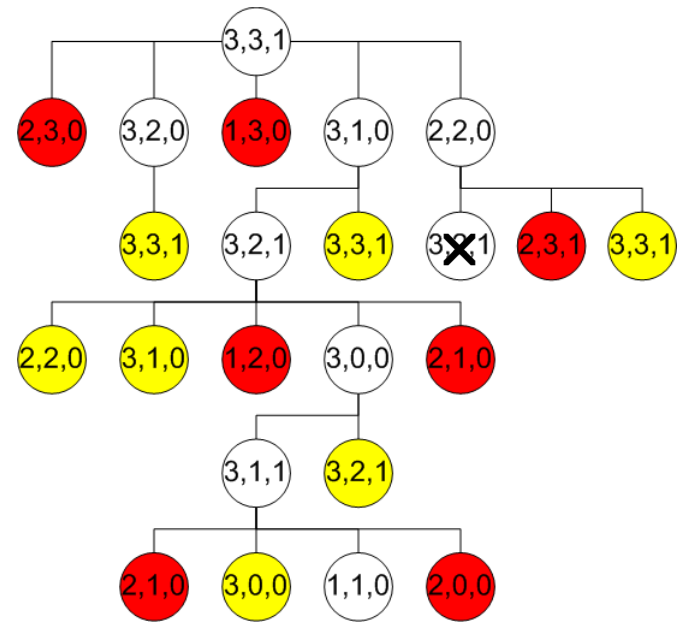
+/- (0,2,1)

+/- (1,1,1)

In that order (left to right)

Red states = missionaries get eaten

Yellow states = repeated states



Breadth-first search on Missionaries & Cannibals

States are generated by applying:

+/- (1,0,1)

+/- (0,1,1)

+/- (2,0,1)

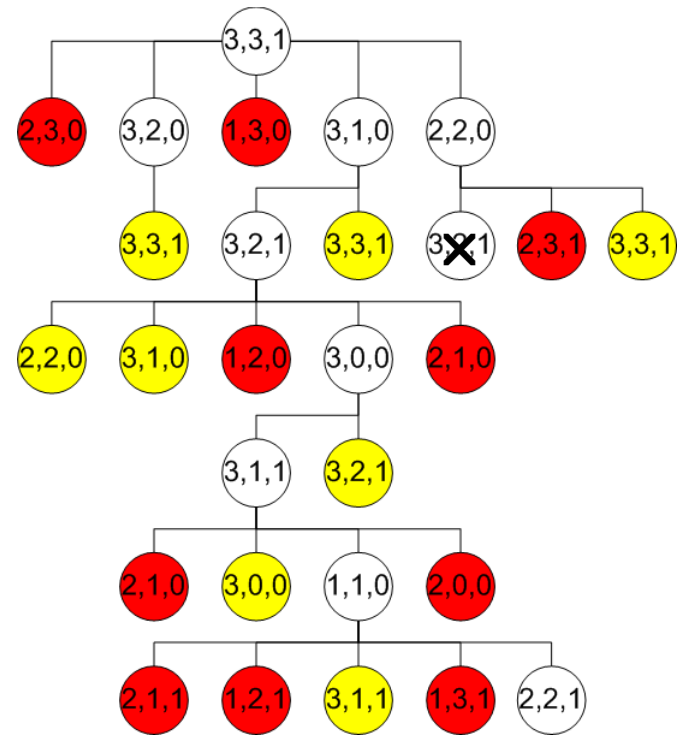
+/- (0,2,1)

+/- (1,1,1)

In that order (left to right)

Red states = missionaries get eaten

Yellow states = repeated states



Breadth-first search on Missionaries & Cannibals

States are generated by applying:

+/- (1,0,1)

+/- (0,1,1)

+/- (2,0,1)

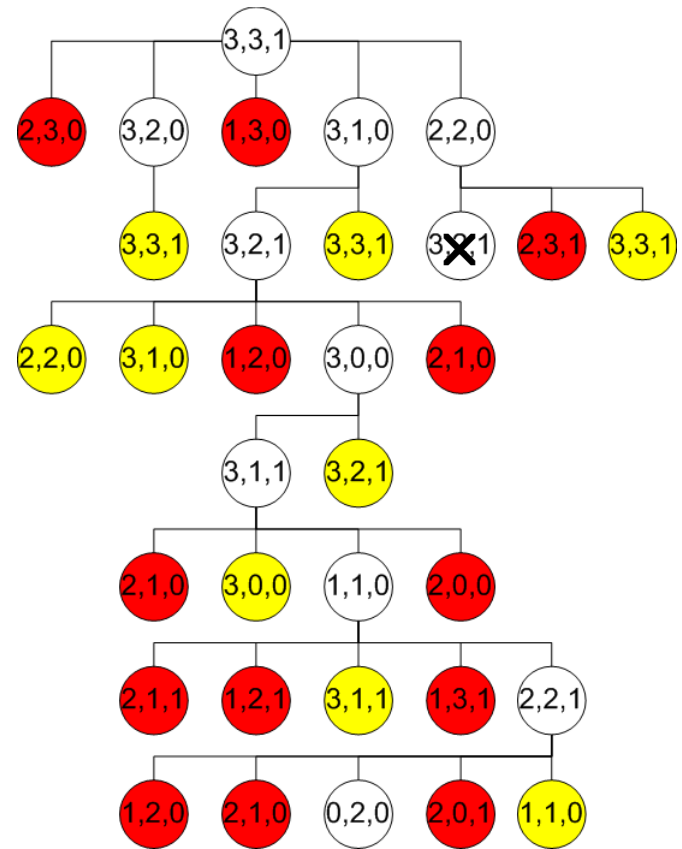
+/- (0,2,1)

+/- (1,1,1)

In that order (left to right)

Red states = missionaries get eaten

Yellow states = repeated states



Breadth-first search on Missionaries & Cannibals

States are generated by applying:

+/- (1,0,1)

+/- (0,1,1)

+/- (2,0,1)

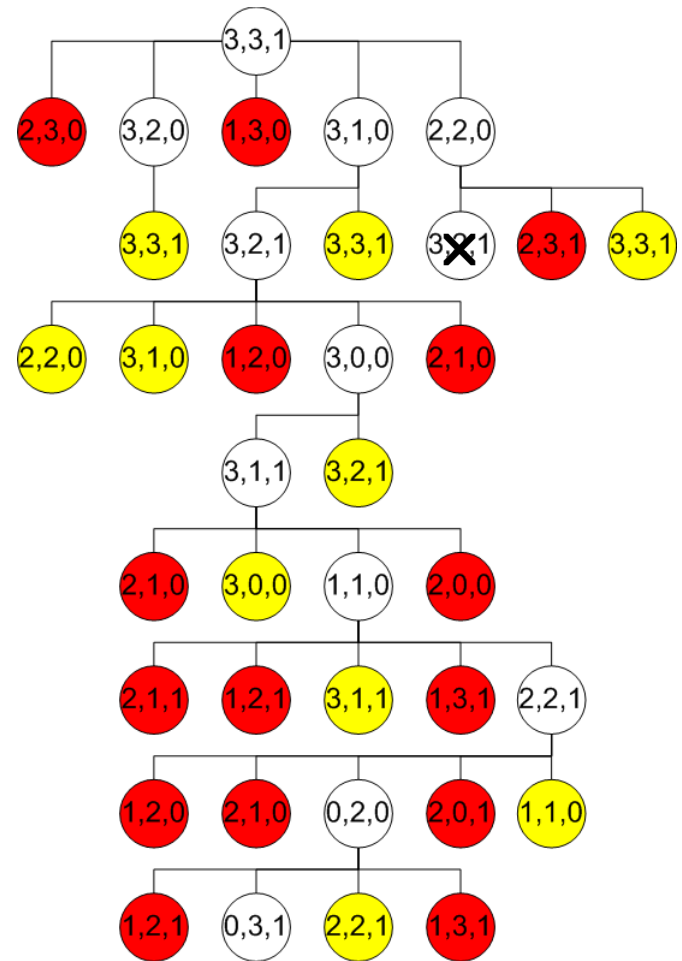
+/- (0,2,1)

+/- (1,1,1)

In that order (left to right)

Red states = missionaries get eaten

Yellow states = repeated states



Breadth-first search on Missionaries & Cannibals

States are generated by applying:

+/- (1,0,1)

+/- (0,1,1)

+/- (2,0,1)

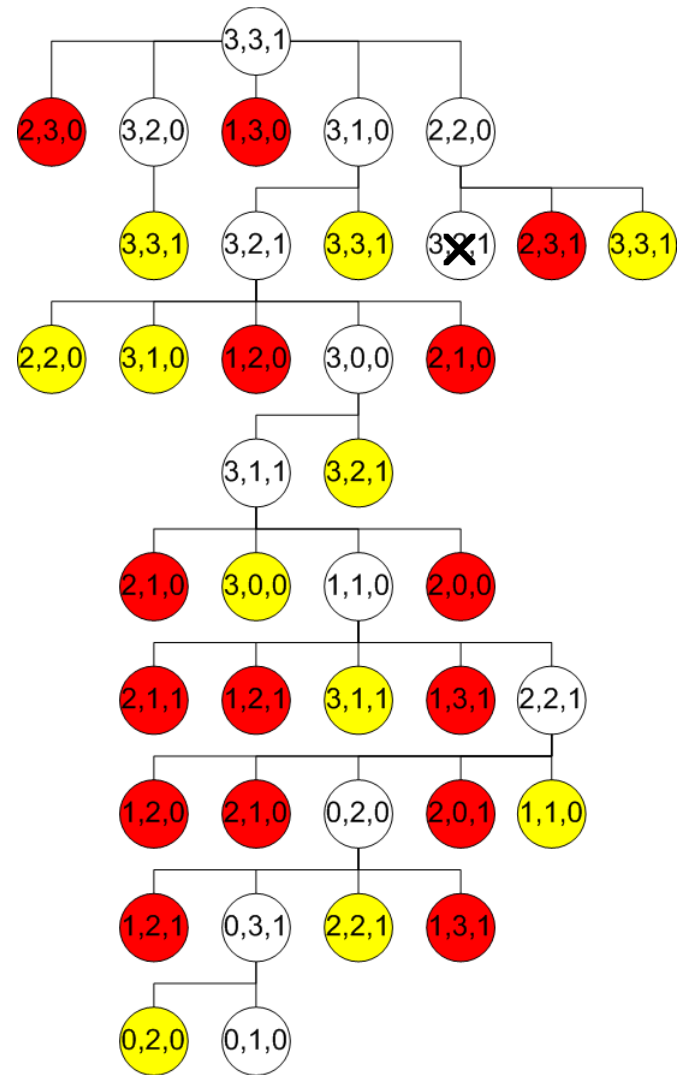
+/- (0,2,1)

+/- (1,1,1)

In that order (left to right)

Red states = missionaries get eaten

Yellow states = repeated states



Breadth-first search on Missionaries & Cannibals

States are generated by applying:

+/- (1,0,1)

+/- (0,1,1)

+/- (2,0,1)

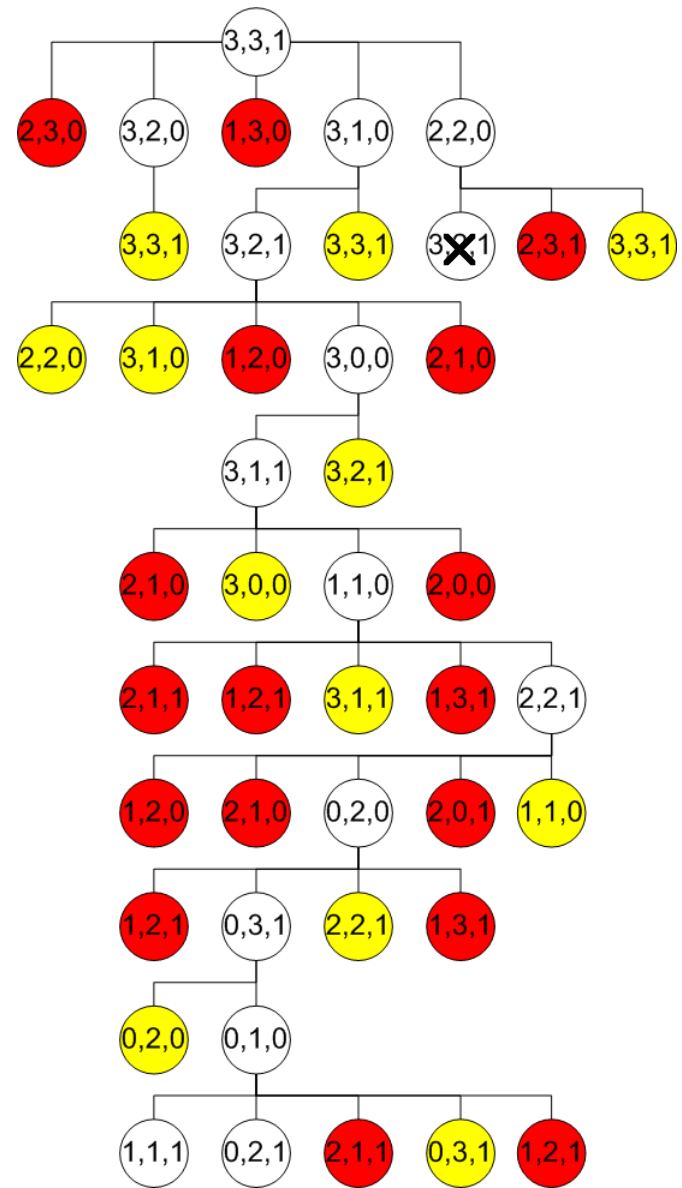
+/- (0,2,1)

+/- (1,1,1)

In that order (left to right)

Red states = missionaries get eaten

Yellow states = repeated states



Breadth-first search on Missionaries & Cannibals

States are generated by applying:

+/- (1,0,1)

+/- (0,1,1)

+/- (2,0,1)

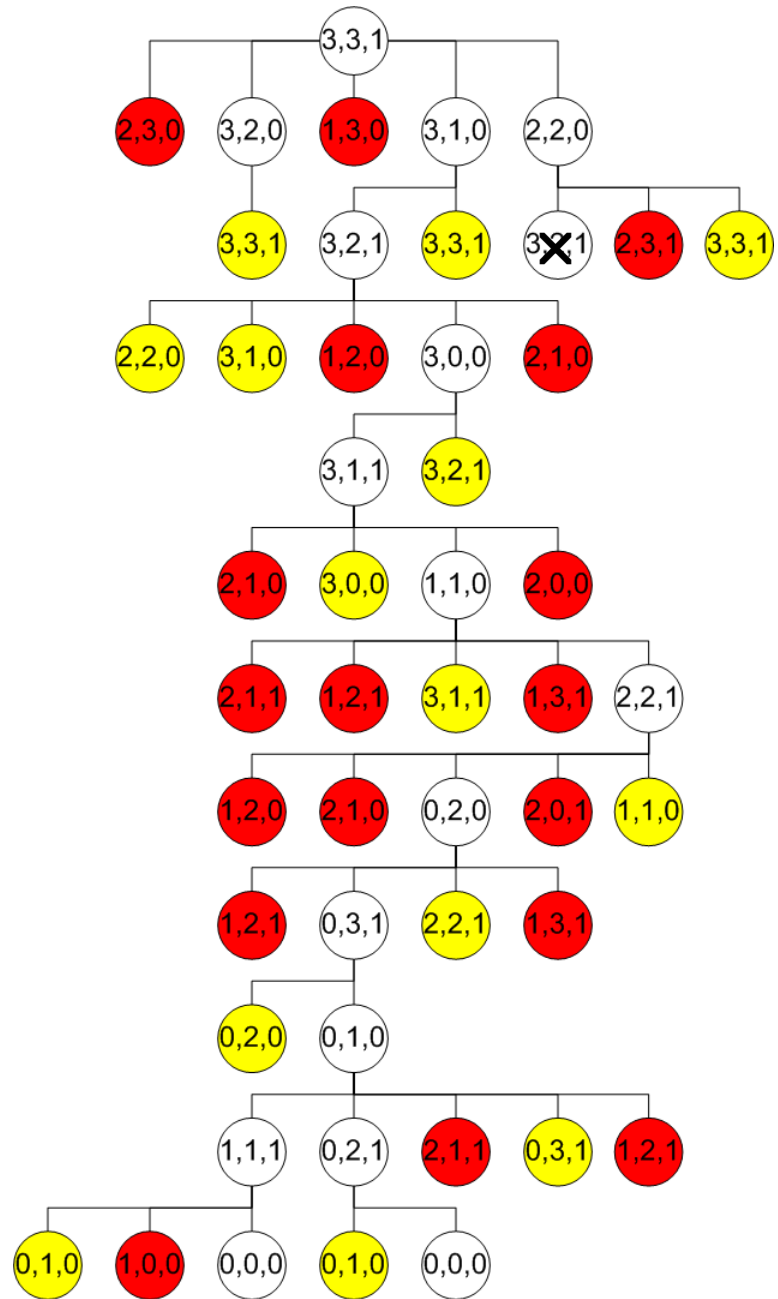
+/- (0,2,1)

+/- (1,1,1)

In that order (left to right)

Red states = missionaries get eaten

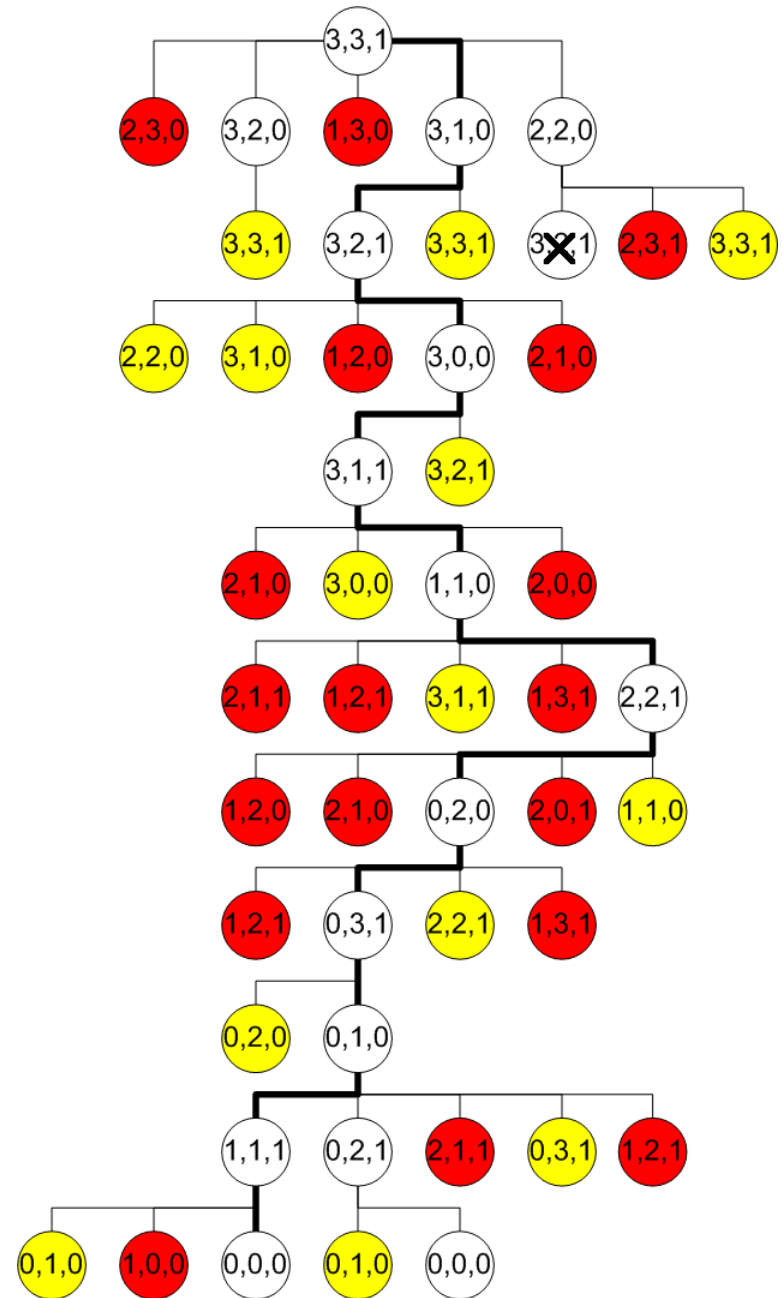
Yellow states = repeated states



Breadth-first search on Missionaries & Cannibals

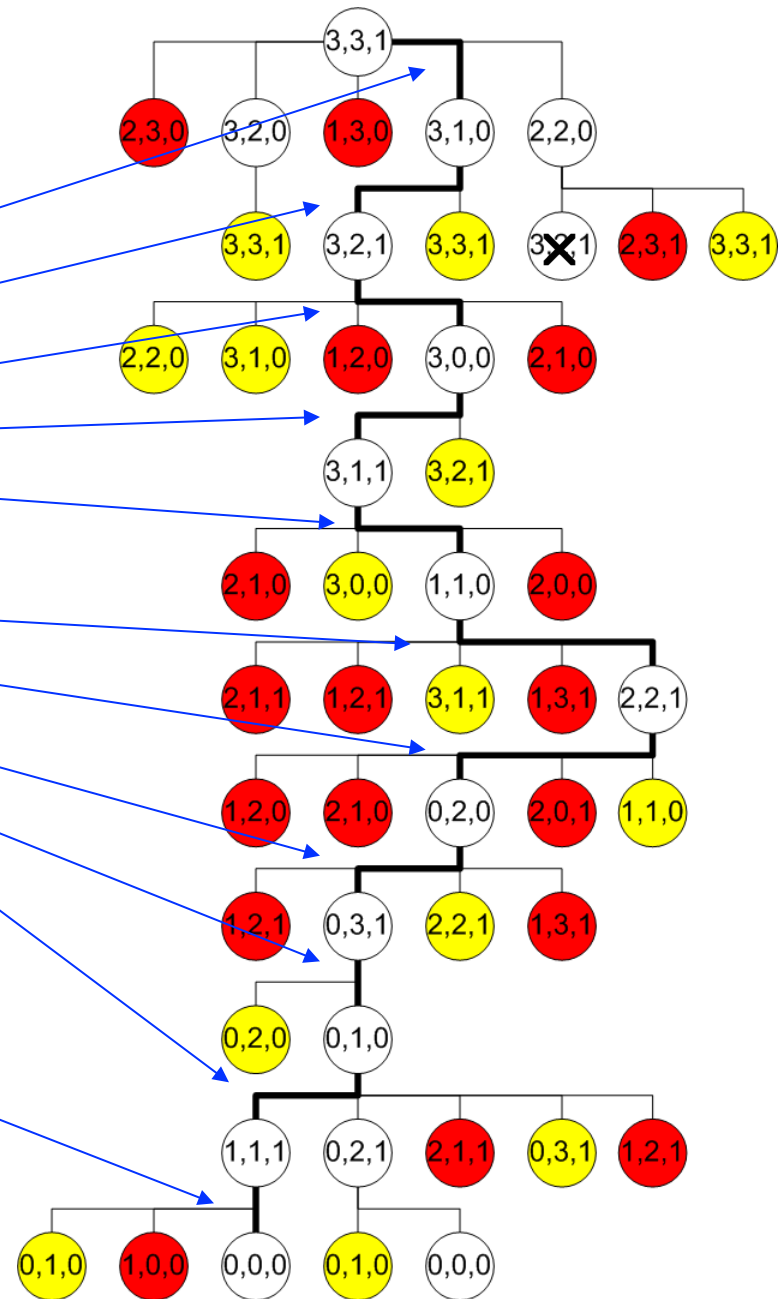
- (0,2,1) [2 cannibals cross L → R]
- + (0,1,1) [1 cannibal crosses R → L]
- (0,2,1) [2 cannibals cross L → R]
- + (0,1,1) [1 cannibal crosses R → L]
- (2,0,1) [2 missionaries cross L → R]
- + (1,1,1) [1 cannibal & 1 missionary cross R → L]
- (2,0,1) [2 missionaries cross L → R]
- + (0,1,1) [1 cannibal crosses R → L]
- (0,2,1) [2 cannibals cross L → R]
- + (1,0,1) [1 missionary crosses R → L]
- (1,1,1) [1 cannibal & 1 missionary cross L → R]

This is an optimal solution (minimum number of crossings). Would Depth-first work?



Breadth-first search on Missionaries & Cannibals

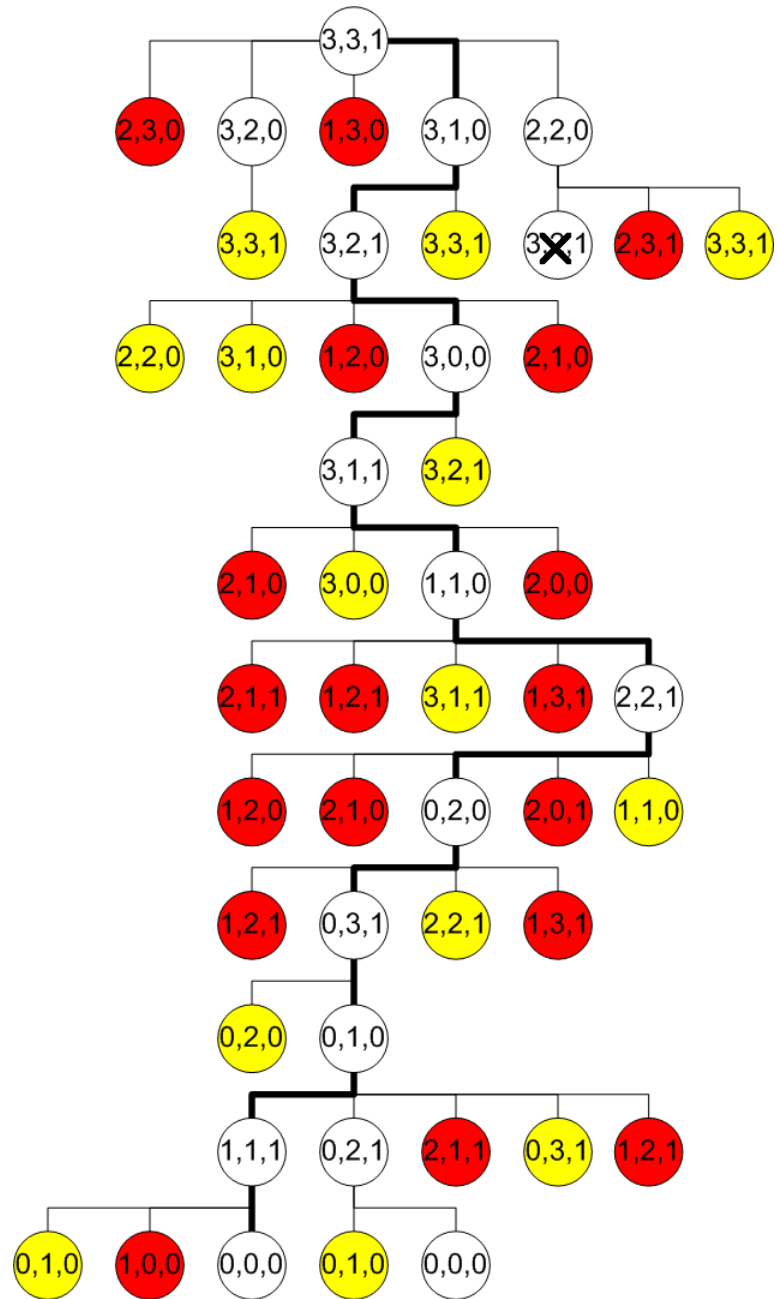
- (0,2,1) [2 cannibals cross L → R]
- + (0,1,1) [1 cannibal crosses R → L]
- (0,2,1) [2 cannibals cross L → R]
- + (0,1,1) [1 cannibal crosses R → L]
- (2,0,1) [2 missionaries cross L → R]
- + (1,1,1) [1 cannibal & 1 missionary cross R → L]
- (2,0,1) [2 missionaries cross L → R]
- + (0,1,1) [1 cannibal crosses R → L]
- (0,2,1) [2 cannibals cross L → R]
- + (1,0,1) [1 missionary crosses R → L]
- (1,1,1) [1 cannibal & 1 missionary cross L → R]



This is an optimal solution (minimum number of crossings). Would Depth-first work?

Breadth-first search on
Missionaries & Cannibals

Expanded 48 nodes



Depth-first search on
Missionaries & Cannibals

Expanded 30 nodes

(if repeated states are
checked, otherwise we end
up in an endless loop)