

# CS4102: Backtracking, Exhaustive Search

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- Read: Section 4.5
  - And slides here
  - You won't be responsible for the Hamilton cycle code in the book
- In class:
  - Look at these slides
  - Work in groups of at most 4 to do the 3 in-class exercises
  - Turn in you work by the end of class

# Graph Search vs. Search in General

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- DFS and BFS
  - A graph is given as input
  - We traverse nodes (that exist in the graph)... following edges that exist in a graph
- A more general form: State-space search
  - Each node represents one state of the problem
  - Adjacent nodes are generated dynamically
  - They're legal states reachable from the current state
  - The algorithm generates one or more states based on the current one
  - Chooses which state to search next (possibly remembering other choices)
  - Backtrack when stuck

# State-space Search Applied

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- Many games and puzzles
  - n-queens problem
  - tic-tac-toe
  - chess
- Many other problems in CS
  - Problem 4.13: subset-sum problem
  - Problem 4.14: Find all m-colorings of a graph
  - These may not be efficient solutions!
    - Exhaustively try all possibilities
- Example later in these slides:
  - Hamilton paths and cycles

**More on state-space search later...**

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# Exhaustive Search

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- Exhaustive search for graphs is just like DFS with one teeny-tiny change

# Remember? Recursive DFS visit

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```
def dfs_recurse0(graph, curnode, visited):
    visited[curnode] = True
    alist = graph.get_adjlist(curnode)
    for v in alist:
        if v not in visited:
            dfs_recurse0(graph, v, visited)
    # about to back up from curnode...
    return
```

- Let's change it slightly!

# Remember? Recursive DFS visit

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```
def exh_srch_rekurs(graph, curnode, visited):
    visited[curnode] = True
    alist = graph.get_adjlist(curnode)
    for v in alist:
        if v not in visited
            exh_srch_rekurs(graph, v, visited)
    # about to back up from curnode..
    visited[curnode] = False
    return
```

- When done with adj. nodes and about to back up, “forget” you’ve been there
  - Using colors? Set it to “white”

## Remember? Recursive DFS visit

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```
dfs_rekurs(adj, start) {  
    // reached node "start"; do something?  
    visit[start] = true  
    trav = adj[start]  
    while (trav != null) {  
        v = trav.ver  
        if (!visit[v])  
            dfs_rekurs(adj, v)  
        trav = trav.next  
    }  
    // about to leave "start"; do something?  
}
```

- Let's change it slightly!



# Recursive Exhaustive Search visit

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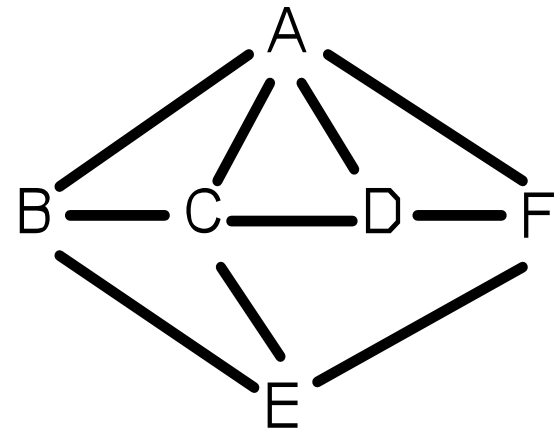
```
exh_search_rekurs(adj,start) {  
    // reached node "start"; do something?  
    visit[start] = true  
    trav = adj[start]  
    while (trav != null) {  
        v = trav.ver  
        if (!visit[v])  
            exh_search_rekurs(adj,v)  
        trav = trav.next  
    }  
    // about to leave "start"; "un-mark" it  
    visit[start] = false  
}
```

# In-class Exercise 1

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- Trace exhaustive search on this graph
  - Start at A
- Draw the exhaustive search tree
  - Visit nodes in alphabetic order when there's a choice
  - Note: after you back up from a node, you can visit it again if you come back to it from another path!
  - Your tree will have more than n nodes in it



# In-class Exercise 2

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- Discuss these questions with your group:
  - What do the set of paths from A to each leaf represent?
  - From the tree, can you identify Hamilton paths?
    - I.e. a simple path that visits all nodes
  - From the tree, can you identify Hamilton cycles?
    - A Hamilton Path that also connects back to start node
- Write down:
  - Describe clearly how you could modify the DFS code to recognize Hamilton paths and Hamilton cycles
  - You can modify the pseudo-code or give me a clear description in words

# Summary of What to Turn In

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- Exercise 1:
  - A drawing of the exhaustive search tree for the given graph
- Exercise 2:
  - How to modify **exh\_search\_rekurs()** to find Hamilton paths and cycles
- **Put the names of all group members on the paper and turn it in**



# N-Queens Problem

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- See the textbook for the explanation
  - Especially Figure 4.5.2 on page 196
- Note:
  - No input graph! Initial state is an empty board
  - Generate new state by placing next queen in next acceptable legal position
  - When impossible to place the next queen, remove it and backtrack to previous state

# Comparison to DFS

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- How is this like DFS?
  - Follow one path as far as you can.
  - Backtrack as little as possible when stuck
- How not like DFS?
  - No fixed set of edges or nodes to limit how much work you do
  - Less clear what to measure in terms of amount of work.
- Possible measures of work
  - Number of states generated (nodes in the graph)
  - Number of attempts to place a queen (cumulative # of attempts listed by nodes in the graph on p. 196)

# In-class Exercise 1

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- Problem 3, page 207:
  - Show all solutions to the 4-queens problem
  - Hints:
    - See figure 4.5.2 on page 196 – they've done one solution for you!
    - Do parallel processing in your group
      - Part of the group does the search with the first queen in row 3, while the other part of the group does the search with the first queen in row 4
- Note: please trace the backtracking search to do this so you understand how this works
  - (There are other ways to do figure this out)



# State Space Search and Best-First Search

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- State-space Search
  - Given a start-state and a goal-state
  - Generate new states that can be “visited” from the current state
  - Choose (somehow) which state to go to next
  - Stop when you reach the goal (or exhaust all possible states)
- Very useful for many problems in Artificial Intelligence
  - Puzzles, games
  - Expert systems
  - Theorem provers
  - Etc.

# Heuristic Search

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- We could use BFS or DFS on such problems
- Use a heuristic to evaluate each state
  - Assigns a value  $f(\text{state})$  that is some measure of how similar the state is to the goal state
- Best-first Search strategy
  - Like BFS but use a priority queue and visit the state that has the highest heuristic score  $f(n)$
  - Open states: a list of states that could be chosen next (i.e. they're in the PQueue)
  - Closed states: a list of states we've already visited (i.e. they're in the tree)

# Best-First Strategy

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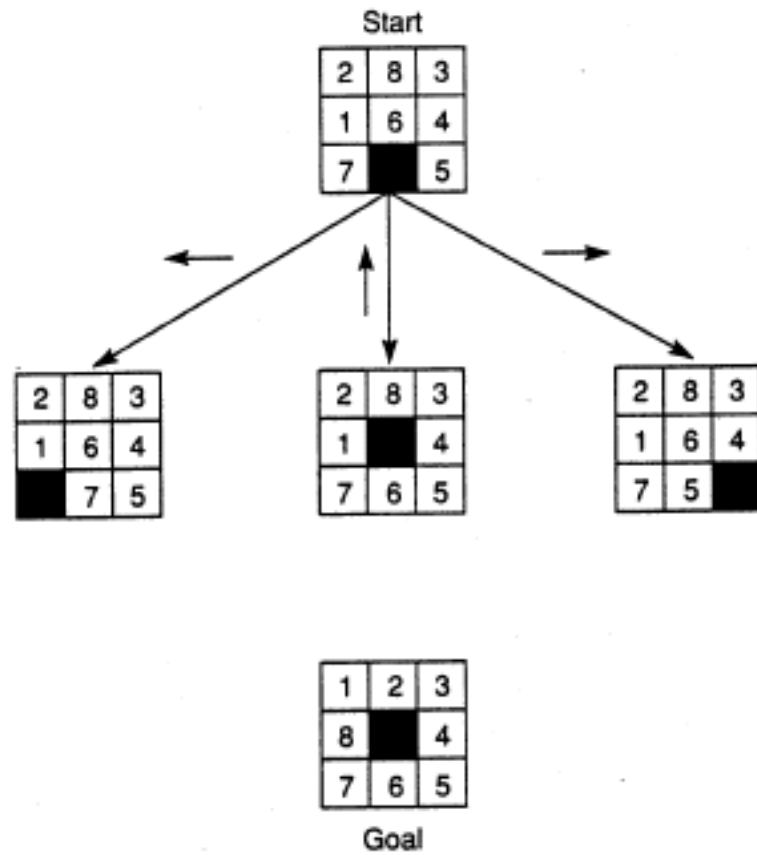
- The strategy:
  - While there are open states in the PQueue
    - `current = PQueue.next();`
    - Put current on the closed list.
    - If current is the goal, we're done
    - For each state  $s$  that can be generated from current
      - If  $s$  is on the closed list, ignore it. Otherwise...
      - Calculate its score  $f(s)$
      - Store  $(s, f(s))$  in the PQueue
    - End for
  - End while

# Example: The 8-puzzle

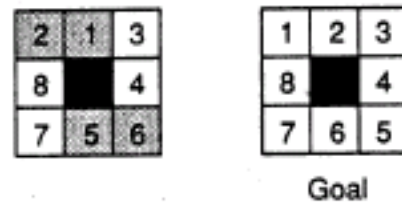
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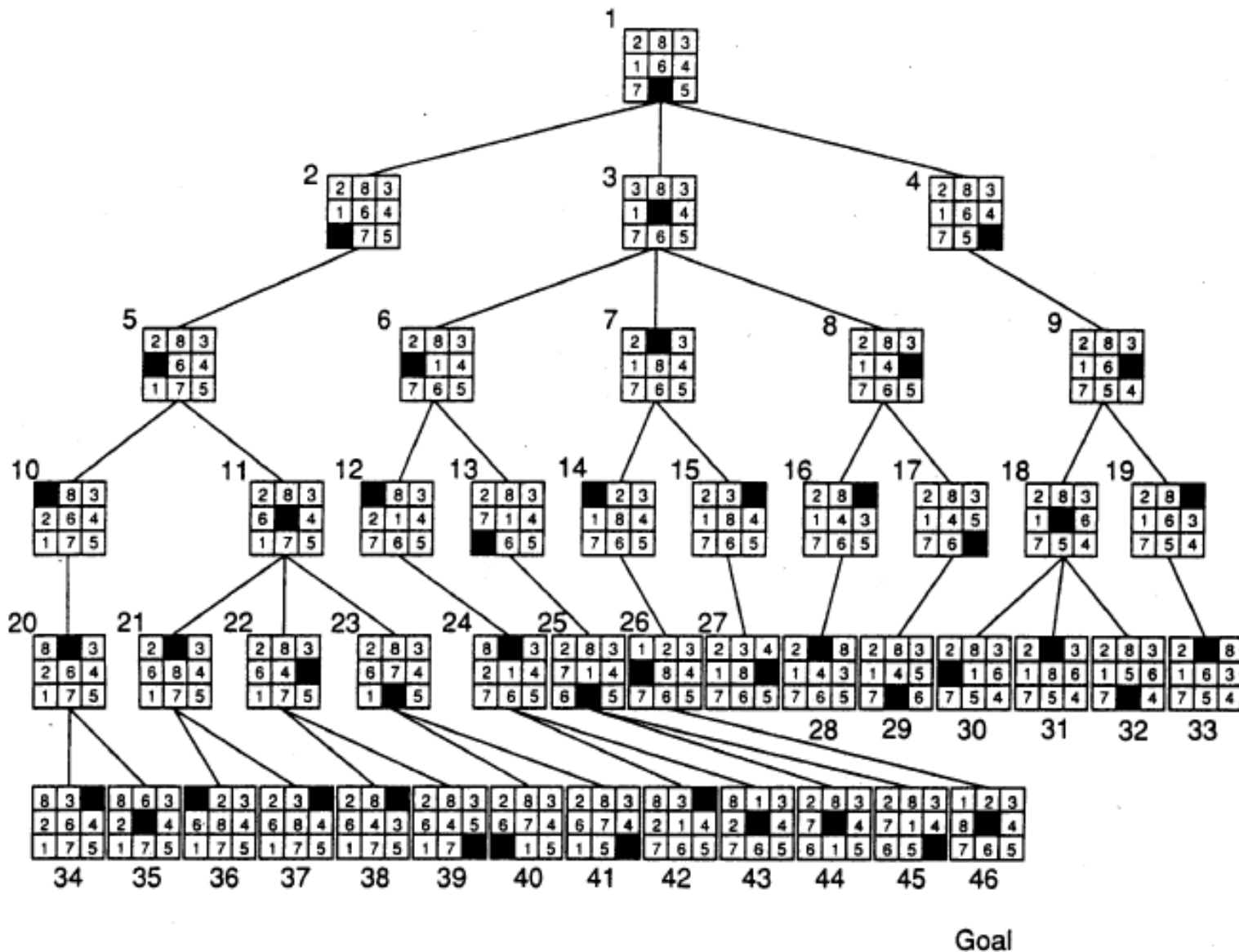
- 8 numbered tiles in a 3x3 frame
- Repeatedly slide a tile into the “blank” position to reach some goal configuration
- Given a current state, generating child-states is what moves are possible
- Heuristic?
  - Count how many tiles (including the blank) are out of position
- See following slides.
- Note: There’s also a 15-puzzle with a 4x4 frame



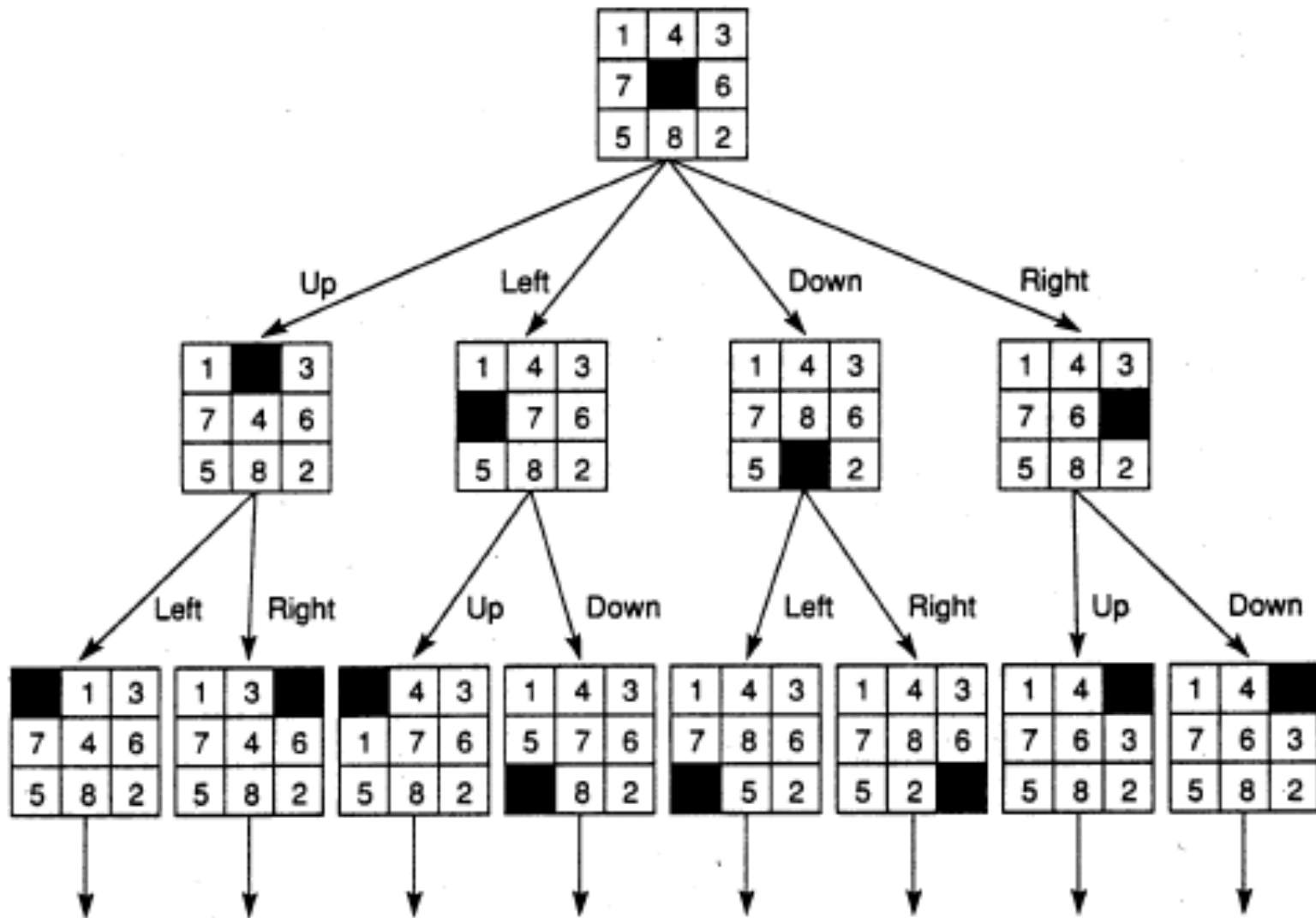
**Figure 5.6** The start state, first set of moves, and goal state for an 8-puzzle instance.



**Figure 5.7** An 8-puzzle state with a goal and two reversals: 1 and 2, 5 and 6.

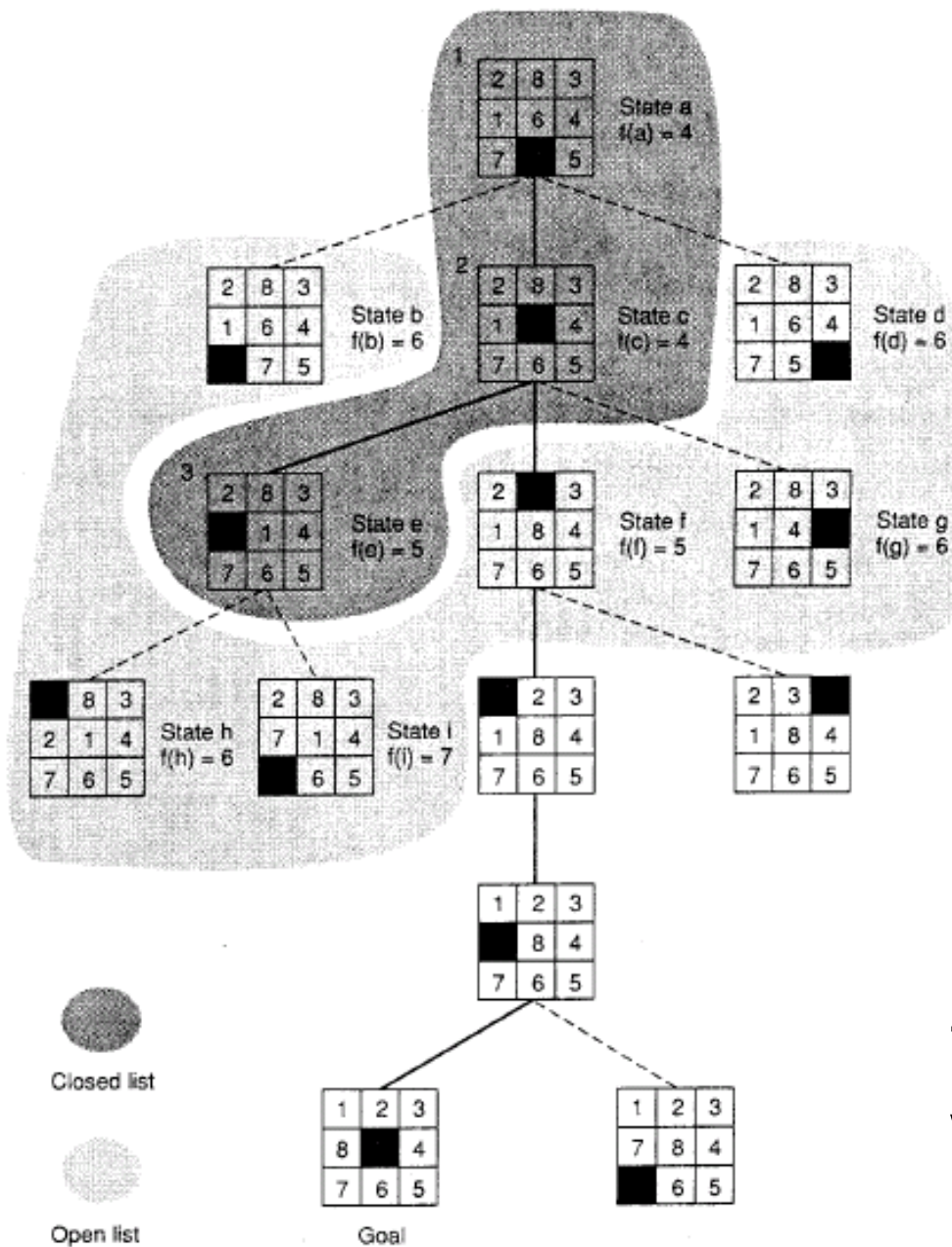


**Figure 3.15** Breadth-first search of the 8-puzzle, showing order in which states were removed from open.



**Figure 3.6** State space of the 8-puzzle generated by "move blank" operations.





**Figure 5.11** open and closed as they appear after the third iteration of heuristic search.

Here  $f(n)$  is a count of how many tiles (incl. the blank) are out of place. The next state that will be chosen will be State-f with score 5

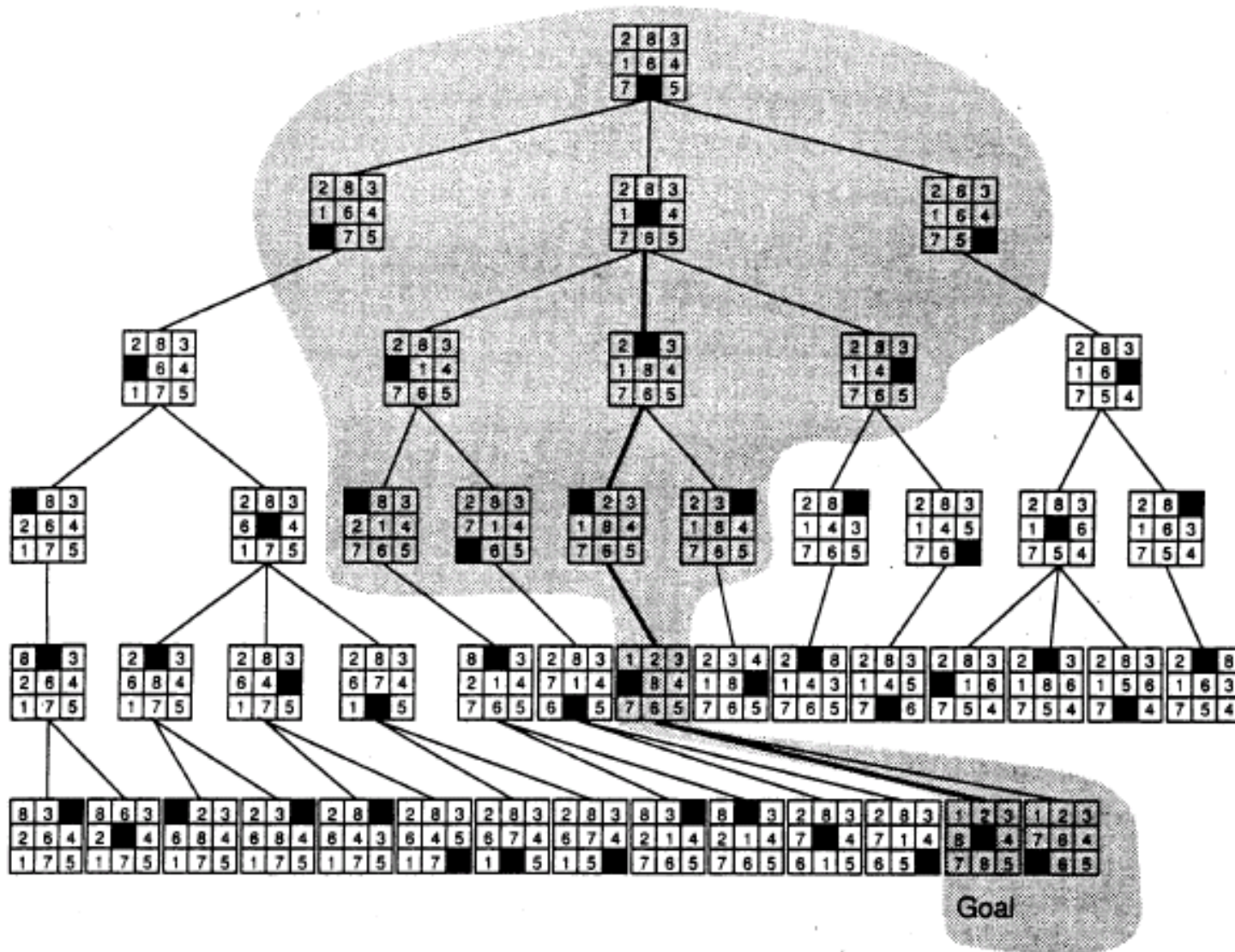


# A Better Use of Heuristics

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- If  $f(n)$  is the number of tiles out of place, this is really an estimate of how many moves are needed to reach the goal.
- Better idea: let  $f(n) = g(n) + h(n)$  where
  - $g(n)$  is the cost to the current node (the length of the path here), and
  - $h(n)$  is an estimate of the cost to reach the goal from the current node



**Figure 5.12** Comparison of state space searched using heuristic search with space searched by breadth-first search. The portion of the graph searched heuristically is shaded. The optimal solution path is in bold. Heuristic used is  $f(n) = g(n) + h(n)$  where  $h(n)$  is tiles out of place.