

MIDDLE EAST TECHNICAL UNIVERSITY
Department of Electrical and Electronics
Engineering

EE 586 Artificial Intelligence

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Programming Take Home

Given: Nov 09, 2017, Due: Nov 27, 2017 (23:59)

In this programming take home, you are required to consider a simple puzzle and develop and compare the problem solving techniques using different search procedures that we have discussed in class. The take home will refresh (or establish) some of the programming skills that you will need for the term projects. Note that you can follow the pseudo-code algorithm descriptions in your main reference text (Russel & Norvig) whenever feasible and convenient in implementing the required algorithms.

Important: You are required to submit (through MetuClass) both a written report and a program pack (a single zip file) which includes a readme.txt file as well as an independent demo executable or a Matlab program which can run on Matlab and does not depend on any toolboxes. The report is expected to include all your work and results such as GUI snapshots, algorithm pseudocodes etc. such that it is possible to evaluate your work without even running the demo program. You will work alone for this take home.

Important: In your written report, (and in a text file in the zip pack) reference all web locations that you have benefited from and links to any source code that you have made use of. You can get ideas and inspiration from code available on the web but you are required to write your own code for any direct questions being asked as part of the take home. Also, you are required to document your code with in-line comments so that someone (me) reading your source code knows exactly what you are doing!

Consider the 8-puzzle game illustrated in the figure below for a random *start state* (a) as well as the desired *goal state* (b). The aim of your AI search program is to attain the goal state from any arbitrary start state. There are many Java implementations of this game and its solution. You are required to implement your own but you can use others to test your solution.

4	8	6
	1	5
2	3	7

(a)

1	2	3
4	5	6
7	8	

(b)

1. (10 points) In your chosen programming language, (C/C++ is preferred but Java and Matlab are equally acceptable) develop a data representation to represent and store the puzzle state. Develop the representation such that it can handle an *N*-puzzle where the size of the puzzle is configurable by the user.

Explain the structure of your representation in your chosen language. Note that apart from the “visible” puzzle state, this representation will also need to keep any bookkeeping information required for a particular search algorithm that you

will implement (such as nodes awaiting expansion, back-pointers etc) One possible alternative for C/C++ is to use the heap memory and pointers to construct a data structure with nodes representing the puzzle states. You might wish to find and review a tutorial on *data structures* from the web. Those of you who are skilled and interested in Object Oriented languages such as C++ may wish to consider separating the representation of the game from the representation of the algorithm so that the search algorithm(s) developed can be used on search problems other than the *L*-puzzle.

2. (10 points) Develop a basic GUI for your program that would satisfy as a minimum the following requirements:
 - a. Let the user select the search algorithm used,
 - b. Display the puzzle state continuously on the screen,
 - c. Let the user single step through the search iterations of the chosen algorithm,
 - d. Display the current iteration count of the search,
 - e. Let the user start/pause/cancel a free-run through the search while displaying each puzzle state and the changing iteration count,
 - f. Be able to generate a random initial state,
 - g. Be able to perform a desired number of monte-carlo simulations (the experiment will be described in more detail as question 8): For N times (selectable by the user), start from the goal state, move M random steps (selectable by the user) away from the goal (avoiding loops), consider the resulting state as the initial state and run the chosen search algorithm to reach back the goal. Accumulate and average over the these N simulations the number of steps taken to reach the goal as well as the amount of memory units used to perform the search.

The initial state of the puzzle can be loaded from a formatted text file for simplicity but you may develop an interface to let the user set up an initial state by mouse interaction with the GUI. If data is loaded from a file, then the interface should have the ability to choose the file name to be loaded.

3. Implement a function called `successors()` that, given any state, can produce the possible next states (results of puzzle moves) from that state in the chosen representation. By using the output of your function, your program should be able to move to those next states in the chosen representation. The function should also be able to handle *L*-puzzle case where *L* is configurable by the user.
4. Consider the following start state of the puzzle. If you are good at 8-puzzle, you may try to solve it yourself. Can you tell how many moves away it is from the goal? (i.e., what is the minimum path to the goal?) You may not be able to find the optimal set of moves even if you solve the puzzle!

(10 points) Now consider the Breadth-First Search algorithm and implement it in your program as one algorithm option. Run it on the given start state.

3	4	6
1		8
7	2	5

- a. How many nodes were expanded (processed) to reach the goal state (and find the optimum move sequence) during the execution of your program?
 - b. How many tiles are moved in the optimum move sequence in order to reach the goal state?
 - c. How much time did your program take to find this solution? (You can use a time measurement function available to your language/OS to answer this as long as you use the same computer for all tests and there are no cpu loading programs running.)
5. (10 points) Now consider the Depth-First Search. Can it be used in its simplest form to solve this puzzle? If not, what is the fix? Implement it the way you see fit to run on the same start state.
 - a. How many nodes were expanded (processed) to reach the goal state (and find the optimum move sequence) during the execution of your program?
 - b. How many tiles are moved in the optimum move sequence in order to reach the goal state?
 - c. How much time did your program take to find this solution?
6. (10 points) Consider now the iterative-deepening search. Again implement this search technique and answer (a)-(c) above for this case.
7. (10 points) Now consider the A*-search algorithm for the same problem with the same initial state.
 - a. Based on your knowledge, comment on the expected performance of the A*-search algorithm for different heuristic function definitions.
 - b. Implement the two functions `heuristic_misplaced(state)` and `heuristic_manhattan(state)` to compute two alternative heuristic function values for the current state as an estimate of the distance to the goal,
 - c. Implement the A*-search case with each of the two proposed heuristic functions to solve the problem, again providing your answers for (a)-(c) in each case.
8. (25 points) Now you are required to provide a comparative study of the behaviors for the algorithms discussed above in terms of number of node expansions until reaching the goal and the required memory storage. These graphs will be plotted against the x-axis which is "true minimum distance to goal". This true distance can be determined while generating the initial state by starting from the goal state and moving away from the goal by a pre-determined number of loop-avoiding steps.

For performing this comparison, it is not enough to run the algorithms on a single initial state and record the algorithm performance. Since each initial state generated by moving away from the goal by a pre-determined number of steps is just one possibility among many others, and algorithms will perform slightly differently with each initial state we need to average performance over many such initial states. This is called a "Monte-Carlo simulation".

Consider the following experimental procedure:

- a. For each experimental point in the two graph (e.g., for a fixed true distance d steps from the goal state) start from the goal state and move away d random steps to generate an initial state for the puzzle,
- b. Start from the resulting initial state and run the tested algorithm until goal state is reached. Record the number

of node expansions (node processing) and the memory allocated (Maybe not bytes stored but rather more high level memory units such as "nodes stored" or "data items stored" etc.)

- c. Repeat the simulation N times for the same algorithm with a different initial state generated again by step (a). You may take $N=20$ or $N=100$ depending on the speed of your computer and hence the resulting duration of the simulations. A higher number of experiments, when averaged, would result in a better estimate of the true performance.
- d. Average the performance parameters (number of nodes expanded and memory units utilized) over these N simulations and generate one graph point.
- e. Repeat (a)-(d) for different true distances M from the goal state, generating M points on each performance graph,
- f. Repeat (a)-(e) for each algorithm considered, plotting each curve on top of the other on the same graph (of the same type!) with a different color. Matlab is the best option for presenting these types of graphs even if the data was generated by another language such as C/C++.
- g. Comment on your findings and compare with expected behavior.

Monte-Carlo simulations are standard practice where performance depends on a random initial condition or random behavior and single simulation performance is not really indicative of true "average" or "expected" performance.

9. (15 points) Experiment with different puzzle sizes by picking an algorithm (e.g. A*-search) and a true distance from the goal. Simulate for a number of different puzzle sizes $K=3 \times 3$, 5×5 , 7×7 and comment on your findings.

Good luck.