

A3

## Part I – Questions (20 points each unless noted otherwise)

1. (40 points) If you are pair **programming** in part II, use pair programming on this question as well. Other questions in Part I must be done without help from your pair programming partner.

Write a Python module newtonraphson.py that contains functions to find the roots of an equation for a polynomial in x using the Newton-Raphson method. Your solution should have the following signature:

```
def NewtonRaphson(fpoly, a, tolerance = .00001):
    """Given a set of polynomial coefficients fpoly
    for a univariate polynomial function,
    e.g. (3, 6, 0, -24) for  $3x^3 + 6x^2 + 0x^1 - 24x^0$ ,
    find the real roots of the polynomial (if any)
    using the Newton-Raphson method.
```

a is the initial estimate of the root and  
starting state of the search

This is an iterative method that stops when the  
change in estimators is less than tolerance.  
"""

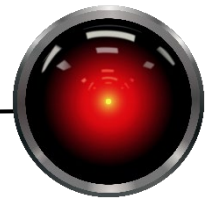
coefficients should be an iterable (tuple or list) of coefficients for the  
powers of x. As an example:

$$7x^4 + 3x^3 - 5x^2 + 32x - 7x^0 = 0$$

would be represented as [7, 3, -5, 32, -7]. Show the answers for the  
equation above given a starting points of x=5 and x = -50:

NewtonRaphson( [7, 3, -5, 32, -7], 5) and  
NewtonRaphson( [7, 3, -5, 32, -7], -50)

Note that only real roots will be returned when we start the search with a  
real value. **You may not use any library functions for taking  
derivatives or evaluating polynomials.** Write auxiliary functions:



```
def polyval(fpoly, x):
    """polyval(fpoly, x)
    Given a set of polynomial coefficients from highest order to x^0,
    compute the value of the polynomial at x. We assume zero
    coefficients are present in the coefficient list/tuple.

    Example: f(x) = 4x^3 + 0x^2 + 9x^1 + 3 evaluated at x=5
    polyval([4, 0, 9, 3], 5))
    returns 548
    """
```

```
def derivative(fpoly):
    """derivative(fpoly)
    Given a set of polynomial coefficients from highest order to x^0,
    compute the derivative polynomial. We assume zero coefficients
    are present in the coefficient list/tuple.

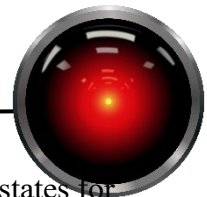
    Returns polynomial coefficients for the derivative polynomial.
    Example:
    derivative((3,4,5)) # 3 * x**2 + 4 * x**1 + 5 * x**0
    returns: [6, 4]    # 6 * x**1 + 4 * x**0
    """
```

2. Show that the Manhattan distance is consistent for N-puzzles if one assumes that the cost of a move is 2 (swap one tile each way)<sup>1</sup>.
3. Avena Cereal Company makes a cereal called Crunchy Oat Clusters. Each cluster has must weigh no less than 1 gram and no more than 2 grams and is composed of a combination of oats, rice, and honey. Avena, hires you, the renowned genetic algorithm expert to optimize their cereal. Their food scientists have developed a function that can predict how crunchy clusters will be given the amounts of oats, rice, and honey:  $f_{crunch}(oats, rice, honey)$ . Describe a set of crossover and mutation functions that do not violate the production constraints.
4. Consider the fairly simple **problem** of selecting 2 matching cards from a deck of cards with pictures on them. The pictures consist of moon, sun, and stars, and there are two instances of each card (6 cards in total). Legal moves are pick a card that has not been picked, and the goal state is matching the first card drawn. Sketch an and-or search tree for this problem. You do not need to draw the full tree, just enough to make it clear that you understand what the full tree would look like.

## Part II: N-Puzzle Search (120 points)

In this assignment, you will write a generic graph search routine that can be used to conduct breadth-first, depth-first, and A\* search by varying the parameters given to it. Several classes are provided to you in package `basicsearch_lib02` to help you in this

<sup>1</sup> Be sure to use this cost in Part II for A\* search.



endeavor and you are required to use them. Do not support multiple solution states for this assignment.

Skeleton code is provided in the following files that can be accessed from Blackboard:

**driver02.py** – The driver module should create 31 different tile board puzzles. For each of these, a solution will be searched using breadth first, depth first, and A\* search using a Manhattan distance heuristic. Keep track of the number of nodes expanded and the amount of time used for each of these. Upon completion, print a table summary that indicates the mean (average) and standard deviation of the following measurements:

- length of plan (number of steps to solution)
- number of nodes expanded
- elapsed time in seconds. Use tic/toc functions provided: `t=tic()`, `tock(t)`

Running the 31 trials will take a little bit of time, so use a much smaller number when debugging. One execution of the 31 trials on an Intel i7-9700U took a little under 19 minutes without exploiting multiple cores (duration depends on the difficulty of the randomly generated puzzles) and it is recommended that you make sure that each search type is working before you try to start looping on solutions.

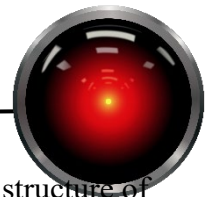
**npuzzle.py** – Partially completed class to represent the problem, derived from a generic Problem representation in `basicsearch_lib02.searchrep`. Complete the skeleton code that is provided for you. When you create a problem to be searched, you should create an instance of this class which will contain an instance of `TileBoard`. The parent class, `Problem`, accepts two keyword arguments that you will need to use (don't forget to call `super`): `g` and `h`. `g` is a cost function and `h` is a heuristic function. See descriptions in modules `searchstrategies` specified below. You can pass a function handle by using the name of the function, e.g. `g=BreadthFirst.g`.

**problemsearch.py** – Implement function `graph_search`. It takes an instance of `NPuzzle` and flags for controlling verbosity and debugging (see file for details) and conducts a search. When instantiating the `NPuzzle`, be sure to use parent class's `g` and `h` arguments to set the path cost and heuristic functions which will govern the type of search that is conducted. It returns a 3 tuple consisting of:

- a plan (list of actions)
- the number of nodes that were expanded.
- the amount of time the search took

You will need to use a priority queue and search nodes (see below)

**searchstrategies.py** – Implement classes `BreadthFirst`, `DepthFirst`, and `Manhattan`. These are classes that provide implementations for the cost to node (`g`) and cost from node to goal heuristic (`h`) functions. Note `g` and `h` are class methods (see details on class methods in the comments of the provided code) and that when you pass them to the `NPuzzle` constructor, you need to pass the function handles to the constructor rather than invoking the function. Concretely, if you wanted to pass `BreadthFirst`'s function handle for `g` to `NPuzzle`, you would call `NPuzzle(num_tiles, g=BreadthFirst.g, ...)`. `NPuzzle`'s parent class stores `g` in a publicly accessible instance variable and other code (e.g. the `Node` class discussed below) will invoke the functions to evaluate search nodes. Note



that we defined DepthFirst's  $g$  as a constant and  $h$  as the negative depth. The structure of the Node implementation expects  $h$  to be called with a single argument: state. As the depth is captured in the Node, and not the state, reverse the roles of  $g$  and  $h$  when implementing DepthFirst. The depth can be accessed from the  $g$  function which expects a parent, action, and the search node itself.

**explored.py** – Implement class Explored. Apart from the no argument constructor, it has two methods: `exists(state)` and `add(state)`. Both of these expect state tuples from a TileBoard and use a hash table to determine whether a state has been seen before (`exists`) and to add new states as they are removed from the frontier set (`add`). The Python builtin hash will generate a hash key from any hashable value. Handle hash key collisions as a bucket list.

The module `basicsearch_lib02` contains several functions that you should use in your implementation. Do not make any changes to these:

**basicsearch\_lib02.queues.py** – Class PriorityQueue should be used to maintain the order of the queue. Remember, we defined  $g$  and  $h$  in a way that priority queues can be used all search types and  $f(\text{node}) = g(\text{node}) + h(\text{node})$ . Order your queue by  $f(\text{node})$ .

**basicsearch\_lib02.searchrep.py** – This module contains classes that will be useful in representing search problems and trees.

The Problem class represents a generic problem class that should be the parent of your NPuzzle class, and as stated has constructor arguments for specifying the  $g$  and  $h$  functions. Class Node should be used to construct a node in the search space, and these are the objects that should be generated in your search. To create the first node, call the constructor with instances of the problem representation, NPuzzle, and the initial state (a TileBoard). To obtain the list of new search states obtainable from a search node, call `expand` with an instance of the problem. It will use the problem's `actions` method to determine the possible actions that can be generated and derive new child nodes. Node's `get_f` function will be useful for maintaining the order of your priority queue. While you need not modify anything in the library, be sure that you understand how this is working. Step through the code with a debugger if you cannot follow it by reading. Finally, `searchrep` provides function `print_nodes` that takes a list of search nodes and prints out their puzzle representations on a single line. You may find this useful for debugging, but otherwise the function provides no purpose.

Turn in:

- Affidavit
- Hard copy of your code including `newtonraphson.py` and output of tables and one path to solution and board representations using A\*. Pair programmers: Submit your code and questions together.
- Submit code to Blackboard (problem 1 and the N-Puzzle code excluding libraries). Pair programmers: Submit only one copy to either account.