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import numpy as np
import time
class Node():
  def __init__(self, state, parent, action, depth, step_cost, path_cost, heuristic_cost):
     self.state = state
     self.parent = parent # Starting with the parent node
     self.action = action # move up, left, down, right
     self.depth = depth # depth of the node in the tree
     self.step_cost = step_cost # g(n), the cost to take the step
     self.path_cost = path_cost # accumulated g(n), the cost to reach the current node
     self.heuristic_cost = heuristic_cost # h(n), cost to reach goal state from the current node
     self.move_up = None
     self.move_left = None
     self.move_down = None
     self.move_right = None
  # see if moving down is valid
  def try_move_down(self):
     # index of the empty tile
     zero_index = [i[0] for i in np.where(self.state == 0)]
    if zero_index[0] == 0:
       return False
     else:
       up_value = self.state[zero_index[0] - 1, zero_index[1]] # value of the upper tile
       new_state = self.state.copy()
       new_state[zero_index[0], zero_index[1]] = up_value
       new_state[zero_index[0] - 1, zero_index[1]] = 0
       return new_state, up_value
  # see if moving right is valid
  def try_move_right(self):
     zero_index = [i[0] for i in np.where(self.state == 0)]
     if zero_index[1] == 0:
       return False
       left_value = self.state[zero_index[0], zero_index[1] - 1] # value of the left tile
       new_state = self.state.copy()
       new state[zero index[0], zero index[1]] = left value
       new_state[zero_index[0], zero_index[1] - 1] = 0
       return new state, left value
  # see if moving up is valid
  def try_move_up(self):
     zero_index = [i[0] for i in np.where(self.state == 0)]
     if zero_index[0] == 2:
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lower_value = self.state[zero_index[0] + 1, zero_index[1]] # value of the lower tile
     new_state = self.state.copy()
     new_state[zero_index[0], zero_index[1]] = lower_value
     new state[zero index[0] + 1, zero index[1]] = 0
     return new_state, lower_value
# see if moving left is valid
def try_move_left(self):
  zero_index = [i[0] for i in np.where(self.state == 0)]
  if zero_index[1] == 2:
     return False
     right_value = self.state[zero_index[0], zero_index[1] + 1] # value of the right tile
     new_state = self.state.copy()
     new_state[zero_index[0], zero_index[1]] = right_value
     new_state[zero_index[0], zero_index[1] + 1] = 0
     return new_state, right_value
# return user specified heuristic cost
def get_h_cost(self, new_state, goal_state, heuristic_function, path_cost, depth):
  if heuristic_function == 'num_misplaced':
     return self.h_misplaced_cost(new_state, goal_state)
  elif heuristic_function == 'manhattan':
     return self.h_manhattan_cost(new_state, goal_state)
  # to make it fair, all the step cost are 1
  # made it a best-first-search with manhattan heuristic function
  elif heuristic function == 'fair manhattan':
     return self.h_manhattan_cost(new_state, goal_state) - path_cost + depth
# return heuristic cost: number of misplaced tiles
def h_misplaced_cost(self, new_state, goal_state):
  cost = np.sum(new_state != goal_state) - 1 # minus 1 to exclude the empty tile
  if cost > 0:
     return cost
     return 0 # when all tiles matches
# return heuristic cost: sum of Manhattan distance to reach the goal state
def h_manhattan_cost(self, new_state, goal_state):
  current = new_state
  goal_position_dic = {1: (0, 0), 2: (0, 1), 3: (0, 2), 8: (1, 0), 0: (1, 1), 4: (1, 2), 7: (2, 0), 6: (2, 1),
                5: (2, 2)}
  sum_manhattan = 0
  for i in range(3):
    for j in range(3):
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if current[i, j] != 0:
          sum_manhattan += sum(abs(a - b) for a, b in zip((i, j), goal_position_dic[current[i, j]]))
  return sum_manhattan
# once the goal node is found, trace back to the root node and print out the path
def print_path(self):
  # create FILO stacks to place the trace
  state_trace = [self.state]
  action_trace = [self.action]
  depth_trace = [self.depth]
  step_cost_trace = [self.step_cost]
  path_cost_trace = [self.path_cost]
  heuristic_cost_trace = [self.heuristic_cost]
  # add node information as tracing back up the tree
  while self.parent:
     self = self.parent
    state_trace.append(self.state)
     action_trace.append(self.action)
     depth_trace.append(self.depth)
     step_cost_trace.append(self.step_cost)
     path_cost_trace.append(self.path_cost)
     heuristic_cost_trace.append(self.heuristic_cost)
  step\_counter = 0
  while state_trace:
     print('step', step_counter)
    print(state_trace.pop())
     print('action=', action_trace.pop(), ', depth=', str(depth_trace.pop()), \
        ', step cost=', str(step_cost_trace.pop()), ', total_cost=', \
        str(path_cost_trace.pop() + heuristic_cost_trace.pop()), '\n')
     step_counter += 1
def breadth_first_search(self, goal_state):
  start = time.time()
  queue = [self] # queue of found but unvisited nodes, FIFO
  queue_num_nodes_popped = 0 # number of nodes popped off the queue, measuring time performance
  queue_max_length = 1 # max number of nodes in the queue, measuring space performance
  depth_queue = [0] # queue of node depth
  path_cost_queue = [0] # queue for path cost
  visited = set([]) # record visited states
  while queue:
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# update maximum length of the queue
if len(queue) > queue_max_length:
  queue_max_length = len(queue)
current_node = queue.pop(0) # select and remove the first node in the queue
queue_num_nodes_popped += 1
current_depth = depth_queue.pop(0) # select and remove the depth for current node
current_path_cost = path_cost_queue.pop(0) # # select and remove the path cost for reaching current node
visited.add(
  tuple(current_node.state.reshape(1, 9)[0])) # avoid repeated state, which is represented as a tuple
# when the goal state is found, trace back to the root node and print out the path
if np.array_equal(current_node.state, goal_state):
  current_node.print_path()
  print('BFS:')
  print('Time-Execution:', str(queue_num_nodes_popped), 'nodes popped off the queue.')
  print('Space-Execution:', str(queue_max_length), 'nodes in the queue at its max.')
  print('Time-complexity: %0.2fs' % (time.time() - start))
  return True
           # see if moving upper tile down is a valid move
if current node.try move down():
  new_state, up_value = current_node.try_move_down()
  # check if the resulting node is already visited
  if tuple(new_state.reshape(1, 9)[0]) not in visited:
    # create a new child node
    current_node.move_down = Node(state=new_state, parent=current_node, action='down',
                       depth=current_depth + 1, \
                       step_cost=up_value, path_cost=current_path_cost + up_value,
                       heuristic_cost=0)
    queue.append(current_node.move_down)
    depth_queue.append(current_depth + 1)
    path_cost_queue.append(current_path_cost + up_value)
if current_node.try_move_right():
  new_state, left_value = current_node.try_move_right()
  if tuple(new_state.reshape(1, 9)[0]) not in visited:
    # create a new child node
    current node.move right = Node(state=new state, parent=current node, action='right',
                       depth=current_depth + 1, \
                       step_cost=left_value, path_cost=current_path_cost + left_value,
                       heuristic_cost=0)
    queue.append(current_node.move_right)
    depth_queue.append(current_depth + 1)
    path cost queue.append(current path cost + left value)
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if current_node.try_move_up():
      new_state, lower_value = current_node.try_move_up()
      # check if the resulting node is already visited
      if tuple(new_state.reshape(1, 9)[0]) not in visited:
         # create a new child node
         current_node.move_up = Node(state=new_state, parent=current_node, action='up',
                          depth=current_depth + 1, \
                          step_cost=lower_value, path_cost=current_path_cost + lower_value,
                          heuristic_cost=0)
         queue.append(current_node.move_up)
         depth_queue.append(current_depth + 1)
         path_cost_queue.append(current_path_cost + lower_value)
    # see if moving right tile to the left is a valid move
    if current_node.try_move_left():
      new_state, right_value = current_node.try_move_left()
      if tuple(new_state.reshape(1, 9)[0]) not in visited:
         # create a new child node
         current_node.move_left = Node(state=new_state, parent=current_node, action='left',
                           depth=current_depth + 1, \
                           step_cost=right_value, path_cost=current_path_cost + right_value,
                           heuristic cost=0)
         queue.append(current_node.move_left)
         depth_queue.append(current_depth + 1)
         path_cost_queue.append(current_path_cost + right_value)
def depth_first_search(self, goal_state):
  start = time.time()
  queue = [self] # queue of found but unvisited nodes, FILO
  queue_num_nodes_popped = 0 # number of nodes popped off the queue, measuring time performance
  queue_max_length = 1 # max number of nodes in the queue, measuring space performance
  depth_queue = [0] # queue of node depth
  path_cost_queue = [0] # queue for path cost
  visited = set([]) # record visited states
  while queue:
    # update maximum length of the queue
    if len(queue) > queue_max_length:
      queue_max_length = len(queue)
    current_node = queue.pop(0) # select and remove the first node in the queue
    queue_num_nodes_popped += 1
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current_depth = depth_queue.pop(0) # select and remove the depth for current node
current_path_cost = path_cost_queue.pop(0) # # select and remove the path cost for reaching current node
visited.add(tuple(current_node.state.reshape(1, 9)[0])) # add state, which is represented as a tuple
# when the goal state is found, trace back to the root node and print out the path
if np.array_equal(current_node.state, goal_state):
  current_node.print_path()
  print('DFS:')
  print('Time-Execution:', str(queue_num_nodes_popped), 'poped off the nodes the queue.')
  print('Space-Execution:', str(queue_max_length), 'maximum nodes in the queue.')
  print('Time-complexity: %0.2fs' % (time.time() - start))
  return True
else:
  # see if moving upper tile down is a valid move
  if current_node.try_move_down():
    new_state, up_value = current_node.try_move_down()
    # check if the resulting node is already visited
    if tuple(new_state.reshape(1, 9)[0]) not in visited:
       # create a new child node
       current_node.move_down = Node(state=new_state, parent=current_node, action='down',
                          depth=current_depth + 1, \
                          step_cost=up_value, path_cost=current_path_cost + up_value,
                          heuristic_cost=0)
       queue.insert(0, current_node.move_down)
       depth_queue.insert(0, current_depth + 1)
       path_cost_queue.insert(0, current_path_cost + up_value)
# see if moving left tile to the right is a valid move
if current_node.try_move_right():
  new state, left value = current node.try move right()
  # check if the resulting node is already visited
  if tuple(new_state.reshape(1, 9)[0]) not in visited:
     # create a new child node
     current_node.move_right = Node(state=new_state, parent=current_node, action='right',
                        depth=current_depth + 1, \
                        step_cost=left_value, path_cost=current_path_cost + left_value,
                        heuristic_cost=0)
     queue.insert(0, current_node.move_right)
    depth gueue.insert(0, current depth + 1)
     path_cost_queue.insert(0, current_path_cost + left_value)
# see if moving lower tile up is a valid move
if current_node.try_move_up():
  new_state, lower_value = current_node.try_move_up()
  if tuple(new_state.reshape(1, 9)[0]) not in visited:
    # create a new child node
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current_node.move_up = Node(state=new_state, parent=current_node, action='up',
                          depth=current_depth + 1, \
                          step_cost=lower_value, path_cost=current_path_cost + lower_value,
                          heuristic_cost=0)
         queue.insert(0, current node.move up)
         depth_queue.insert(0, current_depth + 1)
         path_cost_queue.insert(0, current_path_cost + lower_value)
    # see if moving right tile to the left is a valid move
    if current_node.try_move_left():
      new_state, right_value = current_node.try_move_left()
      if tuple(new_state.reshape(1, 9)[0]) not in visited:
         # create a new child node
         current_node.move_left = Node(state=new_state, parent=current_node, action='left',
                           depth=current_depth + 1, \
                           step_cost=right_value, path_cost=current_path_cost + right_value,
                           heuristic_cost=0)
         queue.insert(0, current_node.move_left)
         depth_queue.insert(0, current_depth + 1)
         path_cost_queue.insert(0, current_path_cost + right_value)
# An extension of BFS that's guided by a prioritized queue based on path cost
def uniform_cost_search(self, goal_state):
  start = time.time()
  queue = [
    (self, 0)] # queue of (found but unvisited nodes, path cost), ordered by path cost(accumulated step cost)
  queue_num_nodes_popped = 0 # number of nodes popped off the queue, measuring time performance
  queue_max_length = 1 # max number of nodes in the queue, measuring space performance
  depth_queue = [(0, 0)] # queue of node depth, (depth, path cost)
  path_cost_queue = [0] # queue for path cost
  visited = set([]) # record visited states
  while queue:
    # sort queue based on path cost, in ascending order
    queue = sorted(queue, key=lambda x: x[1])
    depth_queue = sorted(depth_queue, key=lambda x: x[1])
    path_cost_queue = sorted(path_cost_queue, key=lambda x: x)
    # update maximum length of the queue
    if len(queue) > queue_max_length:
      queue_max_length = len(queue)
    current_node = queue.pop(0)[0] # select and remove the first node in the queue
    queue_num_nodes_popped += 1
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current_depth = depth_queue.pop(0)[0] # select and remove the depth for current node
current_path_cost = path_cost_queue.pop(0) # # select and remove the path cost for reaching current node
visited.add(
  tuple(current_node.state.reshape(1, 9)[0])) # avoid repeated state, which is represented as a tuple
# when the goal state is found, trace back to the root node and print out the path
if np.array_equal(current_node.state, goal_state):
  current_node.print_path()
  print('UCS:')
  print('Time-Execution:', str(queue_num_nodes_popped), 'nodes popped off the queue.')
  print('Space-Execution:', str(queue_max_length), 'nodes in the queue at its max.')
  print('Time-complecity: %0.2fs' % (time.time() - start))
  return True
  # see if moving upper tile down is a valid move
  if current_node.try_move_down():
    new_state, up_value = current_node.try_move_down()
    if tuple(new_state.reshape(1, 9)[0]) not in visited:
       # create a new child node
       current_node.move_down = Node(state=new_state, parent=current_node, action='down',
                         depth=current_depth + 1, \
                         step_cost=up_value, path_cost=current_path_cost + up_value,
                         heuristic_cost=0)
       queue.append((current_node.move_down, current_path_cost + up_value))
       depth_queue.append((current_depth + 1, current_path_cost + up_value))
       path_cost_queue.append(current_path_cost + up_value)
if current_node.try_move_right():
  new state, left value = current node.try move right()
  if tuple(new_state.reshape(1, 9)[0]) not in visited:
    current_node.move_right = Node(state=new_state, parent=current_node, action='right',
                        depth=current_depth + 1, \
                        step_cost=left_value, path_cost=current_path_cost + left_value,
                        heuristic_cost=0)
    queue.append((current_node.move_right, current_path_cost + left_value))
    depth_queue.append((current_depth + 1, current_path_cost + left_value))
     path cost queue.append(current path cost + left value)
if current_node.try_move_up():
  new_state, lower_value = current_node.try_move_up()
  # check if the resulting node is already visited
  if tuple(new_state.reshape(1, 9)[0]) not in visited:
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# create a new child node
            current_node.move_up = Node(state=new_state, parent=current_node, action='up',
                             depth=current_depth + 1, \
                             step_cost=lower_value, path_cost=current_path_cost + lower_value,
                             heuristic_cost=0)
            queue.append((current_node.move_up, current_path_cost + lower_value))
            depth_queue.append((current_depth + 1, current_path_cost + lower_value))
            path_cost_queue.append(current_path_cost + lower_value)
       if current_node.try_move_left():
         new_state, right_value = current_node.try_move_left()
         if tuple(new_state.reshape(1, 9)[0]) not in visited:
            # create a new child node
            current_node.move_left = Node(state=new_state, parent=current_node, action='left',
                               depth=current_depth + 1, \
                               step_cost=right_value, path_cost=current_path_cost + right_value,
                               heuristic_cost=0)
            queue.append((current_node.move_left, current_path_cost + right_value))
            depth_queue.append((current_depth + 1, current_path_cost + right_value))
            path_cost_queue.append(current_path_cost + right_value)
test = np.array([1,2,3,8,6,4,7,5,0]).reshape(3,3)
easy = np.array([1,3,4,8,6,2,7,0,5]).reshape(3,3)
medium = np.array([2,8,1,0,4,3,7,6,5]).reshape(3,3)
hard = np.array([5,6,7,4,0,8,3,2,1]).reshape(3,3)
initial_state = easy
goal_state = np.array([1,2,3,8,0,4,7,6,5]).reshape(3,3)
print (initial_state,'\n')
print (goal_state)
root_node = Node(state=initial_state,parent=None,action=None,depth=0,step_cost=0,path_cost=0,heuristic_cost=0)
root_node.breadth_first_search(goal_state)
# search as far as possible along each branch before backtracking, using stack
root_node.depth_first_search(goal_state)
# search based on path cost, using priority queue
root_node.uniform_cost_search(goal_state)
```

Output:

