

Part1:

$h1 = h\_distance = \text{sum of distances of the tiles to their end positions.}$

$h2 = h\_misplaced = \text{\# of misplaced tiles.}$

Therefore, when running the program with  $\langle N \rangle = 1$ ,  $h\_distance$  is used. And when running the program with  $\langle N \rangle = 2$ ,  $h\_misplaced$  is used.

Let  $n$  be the current node, and  $n'$  be a successor of  $n$ , and  $act$  be a move.

$cost(n, act, n') = 1$  for this tile puzzle problem.

For  $h1$ :

$h1(n')$  can be  $h1(n) + 1$  or  $h1(n) - 1$  since a single move  $act$  can affect only one tile. And it can make this tile 1 position further or closer to its end position. Thus,

$$h1(n') + cost(n, act, n') = h1(n) - 1 + 1 \text{ or } h1(n') + cost(n, act, n') \leq h1(n) + 2$$

So  $h1(n) \leq h1(n') + cost(n, act, n')$ . Therefore,  $h1$  is consistent.

For  $h2$ :

$h2(n')$  can be  $h2(n) + 1$  or  $h2(n)$  or  $h2(n) - 1$  since a single move  $act$  can affect only one tile. And after this move, this tile can have one of the following three state changes:

corret\_pos  $\rightarrow$  wrong\_pos

wrong\_pos1  $\rightarrow$  wrong\_pos2

wrong\_pos  $\rightarrow$  correct\_pos

So with similar proof as  $h1$ ,  $h2(n) \leq h2(n') + cost(n, act, n')$ . Therefore,  $h2$  is consistent.

$h1$  dominates  $h2$ :

If a tile  $t$  is in the correct position, it contributes 0 to both heuristics. But if  $t$  is in a wrong position, it contributes 1 to  $h2$ , while it can contribute more than 1 to  $h1$ . For example if tile of number 1 is in location  $board[1][2]$ , it contributes 1 to  $h2$ 's calculation, while it contributes 3 to  $h1$ 's calculation. Therefore, for any node  $n$ ,  $h1(n) \geq h2(n)$ . In other words,  $h1$  dominates  $h2$ .

Part2:

A\* search algorithm has to keep a large number of unexplored nodes in the priority queue. So, it can quickly fill up memory. For 15-puzzle, I need  $O(b^d)$  memory space, where  $d$  is the depth of the solution, and  $b$  is the average number of successor per state, which is 3.

Part3:

I used IDA\* search algorithm for this assignment. IDA\* only keeps the nodes on the current path. Therefore, it requires an amount of memory that is only linear in the length of the solution that it constructs. Therefore, space complexity of IDA\* is  $O(d)$ , where  $d$  is the depth of the solution.

IDA\* finds the shortest path from start node to goal node when the heuristic function  $h$  is admissible. So IDA\* is both complete and optimal.

With higher  $h(n)$  value, time complexity is higher, since it will explore more states with higher  $h(n)$  value.

Part4:

Time  $t$  is in unit ms.

	A* with h1	A* with h2	IDA* with h1	IDA* with h2
8-puzzle-1	s=4 t=0.5 d=4	s=4 t $\approx$ 0 d=4	s=83 t=2 d=4	s=6 t=0.5 d=4
8-puzzle-2	s=2 t $\approx$ 0 d=2	s=2 t=0.5 d=2	s=21 t=0.5 d=2	s=4 t $\approx$ 0 d=2
8-puzzle-3	s=1 t=0.5 d=1	s=1 t $\approx$ 0 d=1	s=6 t=0.5 d=1	s=2 t $\approx$ 0 d=1
8-puzzle-4	s=5 t=1 d=5	s=5 t=0.5 d=5	s=152 t=3.3 d=5	s=6 t $\approx$ 0 d=5
8-puzzle-5	s=4 t=0.5 d=4	s=5 t=1.5 d=4	s=88 t=1.9 d=4	s=11 t=0.5 d=4
8-puzzle-6	s=29 t=5.5	s=60 t=13	s=4687 t=137.4	s=128 t=2

	d=11	d=11	d=11	d=11
8-puzzle-7	s=3 t $\approx$ 0 d=3	s=3 t $\approx$ 0 d=3	s=45 t=1 d=3	s=5 t=0.7 d=3
8-puzzle-8	s=3 t=0.5 d=3	s=3 t=0.5 d=3	s=60 t=2 d=3	s=6 t=0.5 d=3
8-puzzle-9	s=4 t=1 d=4	s=4 t=0.5 d=4	s=91 t=1.5 d=4	s=7 t=0.2 d=4
8-puzzle-10	s=78 t=17 d=20	s=2794 t=830.7 d=20	s=1038662 t=24090 d=20	s=19093 t=321.9 d=20
15-puzzle-1	s=3 t=0.5 d=3	s=3 t=0.5 d=3	s=71 t=1.5 d=3	s=5 t=0.5 d=3
15-puzzle-2	s=39 t=23.6 d=16	s=229 t=59.1 d=16	s=738077 t=23792.4 d=16	s=611 t=15.8 d=16
15-puzzle-3	s=3 t=0.5 d=3	s=3 t=1.5 d=3	s=63 t=1.5 d=3	s=6 t=0.5 d=3
15-puzzle-4	s=1 t $\approx$ 0 d=1	s=1 t $\approx$ 0 d=1	s=7 t $\approx$ 0 d=1	s=2 t $\approx$ 0 d=1
15-puzzle-5	s=2 t $\approx$ 0 d=2	s=2 t=0.5 d=2	s=30 t=1 d=2	s=4 t=0.5 d=2
15-puzzle-6	s=12 t=3 d=8	s=13 t=1.5 d=8	s=3288 t=229.1 d=8	s=24 t=0.9 d=8
15-puzzle-7	s=52 t=19.6 d=13	s=134 t=38.1 d=13	s=193939 t=6646.4 d=13	s=592 t=23 d=13
15-puzzle-8	s=3 t=0.5 d=3	s=3 t=0.5 d=3	s=85 t=3.5 d=3	s=6 t $\approx$ 0 d=3
15-puzzle-9	s=5 t=1.5 d=5	s=8 t=1.5 d=5	s=370 t=10 d=5	s=23 t=0.5 d=5
15-puzzle-10	s=8 t=2 d=8	s=8 t=1 d=8	s=4669 t=124.8 d=8	s=15 t $\approx$ 0 d=8

