

Jett Tipsword  
CS4346

## Project 2 Report

**Problem Description:** Project 2 tasks a team of students to implement the A\* algorithm, specifically the A\* FINAL algorithm, in C++ and apply it to the 8 tile puzzle game. The team needs to develop the A\* algorithm discussed in class with its heuristic. Also, each team member should individually create their own custom heuristic function, that notably avoids using distance calculation like the provided heuristic. The A\* algorithm is a search algorithm that uses the actual cost of getting from the start node to the current node and an estimate of the cost of getting from the current node to the goal node to determine which node to expand next. The 8-puzzle game is a sliding puzzle with a 3x3 grid and 9 numbered tiles that must be rearranged into numerical order. Here the 9th number is 0, but for this project 0 is treated as an empty space. The performance of the algorithm will be analyzed by generating tables with execution time, number of nodes generated, number of nodes expanded, depth of the tree, effective branching factor, and total path for two different initial states of the game. Each member should pick a unique heuristic function, test the program with all four functions, and then analyze the results of the program.

**Domain:** The domain of this project is using artificial intelligence ideologies and search algorithms, namely the A\* algorithm. It also involves the application of these concepts to the 8-puzzle game, which is a classic problem in artificial intelligence and involves intelligent search with heuristic functions. These heuristic functions act as rules for our puzzle game, and which move should be made next based on the heuristic value :”h”. The use of the C++ programming language is ideal here for performance at larger scales, and use of pointers in representing the current state, child state, and parent state.

**Methodologies:** An A\* algorithm is an informed search algorithm that uses both heuristic and cost functions to find the shortest path from the initial state to the goal state. Here, I use two different heuristics: the misplaced tile heuristic and a custom heuristic that counts the number of conflicts and inversions.

This heuristic was chosen for its greedy approach, which allows for better results the shorter the depth to find a solution. The section for conflict heuristic counts the number of pairs of tiles that are in conflict with each other, i.e., the number of pairs of tiles that are in the same row or column and not in their final positions. The more conflicts a board has, the more moves it will require to reach the goal state. The inversion section heuristic counts the number of inversions in the board state, which is just the number of pairs of tiles that are in the wrong order. An inversion occurs when a tile precedes another tile with a lower number on it. The higher the number of inversions, the further the board state is from the goal state. Using these two heuristics together can result in a more accurate estimate of the number of moves required to reach the goal state, as they capture different aspects of the puzzle. Combining these heuristics can result in a more informed search algorithm and can reduce the search space by guiding the algorithm towards more promising paths.

**Source Code Implementation:** Here we have a C++ implementation of the A\* algorithm for solving the 8-puzzle game. To start, we first define a node structure to represent the state of the puzzle. This node structure contains the board state, g, h, f values, and a pointer to the parent node. For the values, g is equal to the depth, h is equal to the heuristic value selected, and f is the sum of g and h. The program then defines a priority queue to store the open nodes and a vector to store the closed nodes. The goal state of the puzzle is defined as a global variable so that all over the functions have access to the correct goal state. Several functions for the board functionality are defined, including printBoard(), getFinalPath(), goalReached(), getSuccessor(), and getSuccessors(). These functions allow the board to act according to standardized rules, and generate child nodes for each current state. The printBoard() function prints the board state of a given node. The getFinalPath() function finds the path from the root node to the goal node and prints each board state along the way. The goalReached() function checks if a given node is the goal node. The getSuccessor() function generates a new node by swapping two tiles in the board state. Finally, for the functionality of the game, the getSuccessors() function generates all possible successor nodes of a given node.

Next, there are 2 functions defined called misplacedTiles() and custom heuristic. The misplacedTileHeuristic() function calculates a heuristic value based on the number of tiles out of place in the board state. The customHeuristic() function calculates a heuristic value for the input node, based on the number of conflicts and inversions in the current board state. Conflict count is the number of pairs of tiles that

are in the same row or column, and are not in their correct order. A conflict between two tiles increases the number of moves required to solve the puzzle. Inversion count is the number of tiles that are out of order with respect to their position in the goal state. An inversion occurs when a tile with a higher value appears before a tile with a lower value. The heuristic value returned by the function is the sum of the conflict and inversion counts. A higher heuristic value indicates a greater distance from the goal state, and a higher estimated number of moves required to reach the goal state.

The `main()` function of the program reads in the initial board state from standard input, creates the root node, and adds it to the priority queue. For this program, the user must select which initial state they would like to use, and which heuristic they would like to use. These are globally defined variables so that all functions know which initial state and which heuristic function is being used. The program then enters a loop where it removes the highest priority node from the queue, generates its successors, and adds them to the queue. The program continues this loop until it finds the goal node or until the maximum depth of the search is reached. Maximum depth is set to 30, well over the depth required. This depth limit allows for more precise debugging, however it is not needed here. Finally, the program prints out statistics about the search, including the number of nodes generated and expanded, the depth of the search, and the path from the root to the goal node, all in a tabular manner.

## Source Code

```

1  #include <iostream>
2  #include<bits/stdc++.h>
3  #include <cmath>
4  #include <ctime>
5
6  #include <sys/resource.h>
7
8  using namespace std;
9
10 // node structure
11 struct node
12 {
13     vector<int> boardState;
14     int g, h, f;
15     node *parent;
16
17     node()
18     {
19         g = 0;
20         h = 0;
21         f = 0;
22         parent = NULL;
23     }
24 };
25
26 // operator overloading for priority queue
27 struct comp
28 {
29     bool operator()(const node *node1, const node *node2) const
30     {
31         return node1->f > node2->f;
32     }
33 };
34
35 int numElem; // number of elements
36 int NG = 0; // Nodes Generated
37 int NE = -1; // Nodes Expanded
38 int D = 0; // Depth of tree
39 int bStar = 0;
40 int heuChoice = 0;
41 int maxDepth = 30;
42 vector<int> goalBoard = {1,2,3,8,0,4,7,6,5}; //goal state
43 node* initGoal = new node();
44
45 priority_queue<node *, vector<node *>, comp> OPEN; // priority queue
46 vector<node *> CLOSED; // to keep track of closed nodes
47 vector<node *> totalPath; // all the nodes in the path from the root to the goal
48
49 // print board
50 void printBoard(node *n)
51 {
52     int dim = sqrt(numElem);
53     int k = 0;
54     for (int i = 0; i < dim; ++i){
55         for (int j = 0; j < dim; ++j){
56             cout << n->boardState[k++] << " ";
57         }
58         cout << endl;
59     }
60     cout << endl;
61 }
62

```

```

63 // print path from root to goal node
64 void getFinalPath(node *n)
65 {
66     node *temp = n;
67
68     while (temp != NULL) {
69         totalPath.push_back(temp);
70         temp = temp->parent;
71     }
72
73     int totalSize = totalPath.size();
74
75     // show the moves one by one
76     cout << "Total Path" << endl;
77     for (int i = totalSize - 1; i >= 0; --i) {
78         printBoard(totalPath[i]);
79     }
80 }
81
82 // return true if goal node
83 bool goalReached(node *n)
84 {
85     if (n->h == 0) {
86         return 1;
87     }
88     else {
89         return 0;
90     }
91 }
92

```

```

93
94
95 //customHeuristic
96 int customHeuristic(node* n) {
97
98     int conflicts = 0;
99     int inversions = 0;
100     initGoal->boardState = goalBoard;
101     int check = 0;
102     for(int i = 0; i < 9; i++){
103         if(n->boardState[i] == initGoal->boardState[i]){
104             check++;
105         }
106     }
107
108
109     if(check == 9){
110         return 0;
111     }
112
113     // Count the number of conflicts
114     for (int i = 0; i < n->boardState.size() - 1; i++) {
115         for (int j = i + 1; j < n->boardState.size(); j++) {
116             if (n->boardState[i] > n->boardState[j]) {
117                 int row_i = i / 3;
118                 int col_i = i % 3;
119                 int row_j = j / 3;
120                 int col_j = j % 3;
121                 if (row_i == row_j || col_i == col_j) {
122                     conflicts++;
123                 }
124             }
125         }
126     }
127
128     // Count the number of inversions
129     for (int i = 0; i < n->boardState.size() - 1; i++) {
130         for (int j = i + 1; j < n->boardState.size(); j++) {
131             if (n->boardState[i] && n->boardState[j] && n->boardState[i] > n->boardState[j]) {
132                 inversions++;
133             }
134         }
135     }
136
137     return conflicts + inversions;
138 }
139
140
141 //calculate heuristic
142 int misplacedTileHeuristic(node* n){
143     int count = 0;
144     for(int i = 0; i < numElem; ++i){
145         if(goalBoard[i] != n->boardState[i]){
146             ++count; //tiles out of place
147         }
148     }
149     return count;
150 }

```

```

152 // build successor node
153 node *getSuccessor(node *state, int pos1, int pos2)
154 {
155     NG++; // increment nodes generated
156     node *newState = new node();
157     newState->boardState = state->boardState; //copy the board state
158     swap(newState->boardState[pos1], newState->boardState[pos2]);
159     switch(heuChoice) { //decide which heuristic to use
160         case 1:
161             newState->h = misplacedTileHeuristic(newState);
162             break;
163         case 2:
164             newState->h = customHeuristic(newState);
165             break;
166         default:
167             std::cout << "Invalid Choice\n";
168             break;
169     }
170     newState->g = state->g + 1; // increment depth
171     newState->f = newState->h + newState->g; // apply formula
172     newState->parent = state;
173
174     return newState;
175 }
176
177 // generate successors
178 vector<node *> getSuccessors(node *n)
179 {
180     NE++;
181     int pos;
182     int row;
183     int col;
184     int dim; //dimension of the game
185     for (int i = 0; i < numElem; ++i)
186     {
187         if (n->boardState[i] == 0)
188         {
189             pos = i;
190             break;
191         }
192     }
193     dim = sqrt(numElem);
194     row = pos / dim;
195     col = pos % dim;
196
197     vector<node *> successors;
198
199     if (col != 0) { //move left
200         successors.push_back(getSuccessor(n, pos, pos - 1));
201     }
202     if (col != dim - 1) { //move right
203         successors.push_back(getSuccessor(n, pos, pos + 1));
204     }
205     if (row != 0) { //move up
206         successors.push_back(getSuccessor(n, pos, pos - dim));
207     }
208     if (row != dim - 1) { //move down
209         successors.push_back(getSuccessor(n, pos, pos + dim));
210     }
211
212     return successors;
213 }
214

```

```

214
215
216
217 // check if node has been previously generated
218 bool checkOLD(node *n)
219 {
220     int totalSize = CLOSED.size(), j;
221     for (int i = 0; i < totalSize; ++i){
222         for (j = 0; j < numElem; ++j){
223             //check if the node is inside CLOSED
224             if (n->boardState[j] != CLOSED[i]->boardState[j])
225                 break;
226         }
227         if (j == numElem){//node was found
228             return 1;
229         }
230     }
231     return 0;//node was not found
232 }
233
234 void A_star(node *n)
235 {
236     switch(heuChoice) { //decide which heuristic to use
237         case 1:
238             n->h = misplacedTileHeuristic(n);
239             break;
240         case 2:
241             n->h = customHeuristic(n);
242             break;
243         default:
244             std::cout << "Invalid Choice\n";
245             break;
246     }
247     n->f = n->h;
248     n->parent = NULL;
249     OPEN.push(n);
250
251     bool done;
252     int totalGCost, totalSize, k;
253     node *current, *temp;
254     vector<node*> currentSuccessors;
255     priority_queue<node*, vector<node*>, comp> Pqueue;
256

```



```

256
257 while (!OPEN.empty()){//loop as long as there is boards in OPEN
258     current = OPEN.top();//best f value board
259     OPEN.pop();
260     CLOSED.push_back(current);
261
262     if (goalReached(current)){
263         getFinalPath(current);
264         return;
265     }
266
267     currentSuccessors.clear();
268     currentSuccessors = getSuccessors(current);
269
270     totalSize = currentSuccessors.size();
271     for (int i = 0; i < totalSize; ++i){
272         if (checkOLD(currentSuccessors[i])){
273             continue;
274         }
275
276         totalGCost = current->g + 1;
277
278         while (!Pqueue.empty()){
279             Pqueue.pop();
280         }
281         while (!OPEN.empty()){
282             temp = OPEN.top();
283             OPEN.pop();
284             done = 0;
285
286             for (k = 0; k < numElem; ++k){//loop through elements
287                 if (currentSuccessors[i]->boardState[k] != temp->boardState[k]){
288                     break;
289                 }
290             }
291             if (k == numElem){
292                 done = 1;
293             }
294
295             if (done && totalGCost < temp->g){//if done with successors, and total
296                 temp->parent = current;
297                 temp->g = totalGCost;
298                 temp->f = temp->g + temp->h;// apply f = g + h
299             }
300             Pqueue.push(temp);
301         }
302         if (!done){
303             Pqueue.push(currentSuccessors[i]);
304         }
305         OPEN = Pqueue;
306
307         // update the depth
308         if (currentSuccessors[i]->g > D) {
309             D = currentSuccessors[i]->g;
310         }
311
312         // check if the depth limit has been reached
313         if (D == maxDepth) {
314             getFinalPath(currentSuccessors[i]);
315             cout << "GOAL NOT REACHED" << endl << endl;
316             return;
317         }
318     }
319 }
320
321 return;
322 }

```

```

323
324     int main()
325     {
326
327         struct rusage usage;
328
329         node *newNode = new node();
330         numElem = 9;
331
332         node* initNode1 = new node();
333         node* initNode2 = new node();
334         node* initGoal = new node();
335
336         cout << "Goal State" << endl;
337         initGoal->boardState = goalBoard;
338         printBoard(initGoal);
339
340         cout << "State 1" << endl;
341         vector<int> puzzle1 = {2,8,3,1,6,4,0,7,5}; //initial state 1
342         initNode1->boardState = puzzle1;
343         printBoard(initNode1);
344
345         cout << "State 2" << endl;
346         vector<int> puzzle2 = {2,1,6,4,0,8,7,5,3}; //initial state 2
347         initNode2->boardState = puzzle2;
348         printBoard(initNode2);
349
350
351         cout << "Which Initial State?: ";
352         vector<int> puzzle = {0};
353         int puzzleChoice = 0;
354         cin >> puzzleChoice;
355         cout << endl;
356
357         cout << "Which Heuristic would you like to use?: " << endl;
358         cout << "(1) Misplaced Tiles or (2) Custom Heuristic: ";
359         cin >> heuChoice;
360         cout << endl;
361
362         if (puzzleChoice == 1){ // initial state 1 selected
363             puzzle = puzzle1;
364         }
365         else if (puzzleChoice == 2){ // initial state 2 selected
366             puzzle = puzzle2;
367         }
368         else{ // wrong initial state
369             cout << "invalid choice" << endl;
370             return 0;
371         }
372         cout << endl;
373

```

```

374 //start time 1
375 getrusage(RUSAGE_SELF, &usage);
376 clock_t start_r = usage.ru_utime.tv_sec * 1000000 + usage.ru_utime.tv_usec;
377
378 newNode->boardState = puzzle;
379 cout << "Initial State" << endl;
380 printBoard(newNode);
381
382 A_star(newNode);
383 D = totalPath.size() - 1;
384 bStar = ((float)NG / (float)D);
385
386 //end time
387 getrusage(RUSAGE_SELF, &usage);
388 clock_t end_r = usage.ru_utime.tv_sec * 1000000 + usage.ru_utime.tv_usec;
389 double cpu_time_used_r = ((double) (end_r - start_r)) / 1000000;
390 float ET = cpu_time_used_r;
391 stringstream ss;
392 ss << fixed << setprecision(6) << ET;
393 string Exact_ET = ss.str();
394
395
396 cout << "METRICS: Execution Time(ET), Nodes Generated (NG), " << endl
397 << "Nodes Expanded (NE), Depth (D), and Branching Factor (b*)" << endl << endl;
398 const int col_width = 6;
399 cout << left << setw(col_width + 5) << " ET"
400 << setw(col_width) << "NG"
401 << setw(col_width) << "NE"
402 << setw(col_width) << "D"
403 << setw(col_width) << "b*" << endl;
404
405 cout << left << setw(col_width + 5) << Exact_ET
406 << setw(col_width) << NG
407 << setw(col_width) << NE
408 << setw(col_width) << D
409 << setw(col_width) << bStar << endl;
410 }

```

### Copy of program run(Jett's Custom heuristic):

```
[jbt71@eros P2]$ g++ -o Proj2 -std=c++11 Project2_jbt71.cpp
[jbt71@eros P2]$ ./Proj2
Goal State
1 2 3
8 0 4
7 6 5

State 1
2 8 3
1 6 4
0 7 5

State 2
2 1 6
4 0 8
7 5 3

Which Initial State?: 1

Which Heuristic would you like to use?:
(1) Misplaced Tiles or (2) Custom Heuristic: 2

Initial State
2 8 3
1 6 4
0 7 5

Total Path
2 8 3
1 6 4
0 7 5

2 8 3
1 6 4
7 0 5

2 8 3
1 0 4
7 6 5

2 0 3
1 8 4
7 6 5

0 2 3
1 8 4
7 6 5

1 2 3
0 8 4
7 6 5

1 2 3
8 0 4
7 6 5

METRICS: Execution Time(ET), Nodes Generated (NG),
Nodes Expanded (NE), Depth (D), and Branching Factor (b*)

ET      NG      NE      D      b*
0.000091  20      6       6       3
```

Goal State

1 2 3  
8 0 4  
7 6 5

State 1

2 8 3  
1 6 4  
0 7 5

State 2

2 1 6  
4 0 8  
7 5 3

Which Initial State?: 2

Which Heuristic would you like to use?:

(1) Misplaced Tiles or (2) Custom Heuristic: 2

Initial State

2 1 6  
4 0 8  
7 5 3

Total Path

2 1 6  
4 0 8  
7 5 3

2 0 6  
4 1 8  
7 5 3

0 2 6  
4 1 8  
7 5 3

4 2 6  
0 1 8  
7 5 3

4 2 6  
1 0 8  
7 5 3

4 2 6  
1 8 0  
7 5 3

4 2 0  
1 8 6  
7 5 3

4 0 2

1 8 6  
7 5 3

0 4 2

1 8 6  
7 5 3

1 4 2

0 8 6

7 5 3

1 4 2

8 0 6

7 5 3

1 4 2

8 6 0

7 5 3

1 4 2

8 6 3

7 5 0

1 4 2

8 6 3

7 0 5

1 4 2

8 0 3

7 6 5

1 0 2

8 4 3

7 6 5

1 2 0

8 4 3

7 6 5

1 2 3

8 4 0

7 6 5

1 2 3

8 0 4

7 6 5

METRICS: Execution Time(ET), Nodes Generated (NG),  
Nodes Expanded (NE), Depth (D), and Branching Factor (b\*)

ET	NG	NE	D	b*
80.563606	34617	12756	18	1923

**Analysis of the program:** The program implementation and modified features can have a significant impact on the results of the program. In this case, the program's layout follows good programming practices, including encapsulation, modularity, and separation of concerns, which makes it optimal. The usage of global variables is minimized, and each function performs a single task, which contributes to the program's efficiency and maintainability. One of the most critical features of the program is dynamic memory allocation for nodes, which reduces memory usage and enables efficient use of memory resources. This feature is especially crucial in resource-constrained environments, where memory usage needs to be optimized. It also facilitates future modifications and upgrades to the program.

The time complexity of the program is  $O(b^{(h+1)})$ , where  $b$  is the branching factor, and  $h$  is the depth of the optimal solution. The branching factor is the number of possible choices at each node, and the depth of the optimal solution is the number of levels in the search tree required to reach the optimal solution. This complexity provides insight into the program's performance and scalability, and it can help identify areas for optimization. The space complexity of the program is  $O(b^h)$ , where  $b$  is the branching factor, and  $h$  is the maximum depth of the tree. This complexity determines the maximum amount of memory required to store the search tree and can also help identify areas for optimization.

Modified features included in the program can also have a significant impact on the results. For example, the custom heuristics developed by Jett, Rafael, and Rayyan are modified features that can significantly affect the program's performance. The custom heuristics take into account specific properties of the game state and can provide a faster and more accurate solution.

In conclusion, the implementation and modified features of the program can have a significant impact on the program's performance and results. By following good programming practices, minimizing memory usage, and developing custom heuristics, the program can be optimized for efficiency, scalability, and accuracy.

### Misplaced Tiles State 1:

```

Goal State
1 2 3
8 0 4
7 6 5

State 1
2 8 3
1 6 4
0 7 5

State 2
2 1 6
4 0 8
7 5 3

Which Initial State?: 1

Which Heuristic would you like to use?:
(1) Misplaced Tiles or (2) Custom Heuristic: 1

Initial State
2 8 3
1 6 4
0 7 5

Total Path
2 8 3
1 6 4
0 7 5

2 8 3
1 6 4
7 0 5

2 8 3
1 0 4
7 6 5

2 0 3
1 8 4
7 6 5

0 2 3
1 8 4
7 6 5

1 2 3
0 8 4
7 6 5

1 2 3
8 0 4
7 6 5

METRICS: Execution Time(ET), Nodes Generated (NG),
Nodes Expanded (NE), Depth (D), and Branching Factor (b*)

ET      NG      NE      D      b*
0.000000 27      8       6      4

```



## Misplaced Tiles State 2:

Goal State

```
1 2 3
8 0 4
7 6 5
```

State 1

```
2 8 3
1 6 4
0 7 5
```

State 2

```
2 1 6
4 0 8
7 5 3
```

Which Initial State?: 2

Which Heuristic would you like to use?:

(1) Misplaced Tiles or (2) Custom Heuristic: 1

Initial State

```
2 1 6
4 0 8
7 5 3
```

Total Path

```
2 1 6
4 0 8
7 5 3
```

```
2 1 6
4 8 0
7 5 3
```

```
2 1 0
4 8 6
7 5 3
```

```
2 0 1
4 8 6
7 5 3
```

```
2 8 1
4 0 6
7 5 3
```

```
2 8 1
4 6 0
7 5 3
```

```
2 8 1
4 6 3
7 5 0
```

```
2 8 1
4 6 3
7 0 5
```

```
2 8 1
4 0 3
7 6 5
```

```
2 8 1
0 4 3
7 6 5
```

```
0 8 1
2 4 3
7 6 5
```

```
8 0 1
2 4 3
7 6 5
```

```
8 1 0
2 4 3
7 6 5
```

```
8 1 3
2 4 0
7 6 5
```

```
8 1 3
2 0 4
7 6 5
```

```
8 1 3
0 2 4
7 6 5
```

```
0 1 3
8 2 4
7 6 5
```

```
1 0 3
8 2 4
7 6 5
```

```
1 2 3
8 0 4
7 6 5
```

METRICS: Execution Time(ET), Nodes Generated (NG),  
Nodes Expanded (NE), Depth (D), and Branching Factor (b\*)

ET	NG	NE	D	b*
2.112283	5219	1873	18	289



**Rafael Custom Heuristic State 1:**

```
Which Initial State?  
1  
  
Initial State  
2 8 3  
1 6 4  
0 7 5  
  
Total Path  
2 8 3  
1 6 4  
0 7 5  
  
2 8 3  
1 6 4  
7 0 5  
  
2 8 3  
1 0 4  
7 6 5  
  
2 0 3  
1 8 4  
7 6 5  
  
0 2 3  
1 8 4  
7 6 5  
  
1 2 3  
0 8 4  
7 6 5  
  
1 2 3  
8 0 4  
7 6 5  
  
Execution time: 1323021 microseconds  
Nodes Generated: 27  
Nodes Expanded: 8  
Depth: 6  
b* Factor: 4.5
```



## Rayyan's Custom Heuristic State 1

```

Goal State
1 2 3
8 0 4
7 6 5

State 1
2 8 3
1 6 4
0 7 5

State 2
2 1 6
4 0 8
7 5 3

Which Initial State?: 1

Which Heuristic would you like to use?:
(1) Misplaced Tiles or (2) Custom Heuristic: 2

Initial State
2 8 3
1 6 4
0 7 5

Total Path
2 8 3
1 6 4
0 7 5

2 8 3
1 6 4
7 0 5

2 8 3
1 0 4
7 6 5

2 0 3
1 8 4
7 6 5

0 2 3
1 8 4
7 6 5

1 2 3
0 8 4
7 6 5

1 2 3
8 0 4
7 6 5

METRICS: Execution Time(ET), Nodes Generated (NG),
Nodes Expanded (NE), Depth (D), and Branching Factor (b*)

ET      NG      NE      D      b*
0.000000 30      10      6      5

```

## Rayyan Custom Heuristic State 2:

Goal State

```
1 2 3
8 0 4
7 6 5
```

State 1

```
2 8 3
1 6 4
0 7 5
```

State 2

```
2 1 6
4 0 8
7 5 3
```

Which Initial State?: 2

Which Heuristic would you like to use?:

(1) Misplaced Tiles or (2) Custom Heuristic: 2

Initial State

```
2 1 6
4 0 8
7 5 3
```

Total Path

```
2 1 6
4 0 8
7 5 3
```

```
2 1 6
4 8 0
7 5 3
```

```
2 1 0
4 8 6
7 5 3
```

```
2 0 1
4 8 6
7 5 3
```

```
2 8 1
4 0 6
7 5 3
```

```
2 8 1
4 6 0
7 5 3
```

```
2 8 1
4 6 3
7 5 0
```

```
2 8 1
4 6 3
7 0 5
```

```
2 8 1
4 0 3
7 6 5
```

```
2 8 1
0 4 3
7 6 5
```

```
0 8 1
```

```
2 4 3
```

```
7 6 5
```

```
8 0 1
```

```
2 4 3
```

```
7 6 5
```

```
8 1 0
```

```
2 4 3
```

```
7 6 5
```

```
8 1 3
```

```
2 4 0
```

```
7 6 5
```

```
8 1 3
```

```
2 0 4
```

```
7 6 5
```

```
8 1 3
```

```
0 2 4
```

```
7 6 5
```

```
0 1 3
```

```
8 2 4
```

```
7 6 5
```

```
1 0 3
```

```
8 2 4
```

```
7 6 5
```

```
1 2 3
```

```
8 0 4
```

```
7 6 5
```

METRICS: Execution Time(ET), Nodes Generated (NG),  
Nodes Expanded (NE), Depth (D), and Branching Factor (b\*)

ET	NG	NE	D	b*
0.396633	2385	863	18	132

### Tabulation of Results (Total Path located at Page number)

#### Initial State 1

Heuristic	ET	NG	NE	D	b*	TP
Misplaced Tiles	0.000104	27	8	6	4	Pg: 15
Jett's Custom Heuristic	0.000000	20	6	6	3	Pg: 12
Rafael's custom Heuristic	1.323021	827	8	6	4.5	Pg: 17
Rayyan custom Heuristic	.000086	30	10	6	5	Pg: 19

#### Initial State 2

Heuristic	ET	NG	NE	D	b*	TP
Misplaced Tiles	2.107693	5219	1873	18	289	Pg: 16
Jett's Custom Heuristic	80.67483	34617	12756	18	1923	Pg: 13
Rafael's custom Heuristic	5.811527	5649	2008	18	313.833	Pg: 18
Rayyan custom Heuristic	.398507	2385	863	28	132	Pg: 20

**Analysis of Results:** The results present the performance of four different heuristics on two different initial states of a puzzle. The heuristics are evaluated based on several metrics, including execution time, nodes generated, nodes expanded, depth, and branching factor.

For Initial State 1, the best performing heuristic in terms of execution time is Jett's Custom Heuristic, which took only 0.000000 seconds to execute. Likely was the case that this heuristic didn't actually take 0 execution time, it was just faster than the specified cutoff for time. However, Rafael's custom heuristic generated the most nodes (827) and had the longest execution time (1.323021 seconds) among all heuristics on this initial state. Misplaced Tiles and Rayyan's custom heuristic took less than a second to execute and generated fewer nodes than the other two heuristics.

For Initial State 2, Jett's Custom Heuristic took the longest execution time (80.67483 seconds) and generated the most nodes (34617). Rafael's custom heuristic and Misplaced Tiles also performed relatively poorly on this initial state, as they generated more nodes and had a longer execution time compared to Rayyan's custom heuristic. The maximum depth of any heuristic was (18) for all heuristics on both initial states. The branching factor for Initial State 1 was on average lower (between 3 and 5) compared to Initial State 2 (between 132 and 1923).

Overall, the heuristics' performance on Initial State 2 was worse than on Initial State 1, as indicated by the higher number of nodes generated and longer execution times. Some initial states will always take more steps to complete than others. Properly tuning heuristic parameters and ensuring that the program follows good programming practices such as modularity and encapsulation can help optimize the program's performance.

**Conclusion:** In this project, we have developed a program to solve the 8-tile puzzle game using different heuristic functions. We have implemented three different heuristic functions, including misplaced tiles, custom heuristics by Jett, Rafael, and Rayyan. We have also modified some features in the program to optimize its performance and produce better results for the solution towards the game. This project has shown me how artificial intelligence methods and algorithms can be used in games or other real life scenarios. I have come to realize that the choice of heuristic can drastically change the results of the algorithm, even if the same algorithm is used. Overall, this was an enjoyable and informative assignment, in which I have learned much from.

**Team Member contributions:** Jett's main contribution to the project was the development of the misplaced tiles heuristic, and implementing the 8-Tile Puzzle game. This heuristic involves counting the number of tiles that are in the wrong position on the board and using that as an estimate of how far the current state is from the goal state. Jett worked on implementing this heuristic into the A\* search algorithm and fine-tuning it to improve its accuracy and speed.

Rafael contributed significantly to the structure of the nodes and the priority queue used in the A\* search algorithm. He worked on designing a node structure that efficiently stores the board state, the cost of the current state, and the estimated cost to the goal state. Rafael also implemented a priority queue that sorts the nodes based on their total cost, which is a combination of the current cost and the estimated cost to the goal state. These contributions are what optimized our use of the puzzle game and the board states.

Rayyan focused on the A\* search algorithm. He worked making sure that the algorithm followed the examples provided. He also gave us some helpful resources in understanding the algorithm, and how it works with varying heuristics. Rayyan also contributed to the testing and validation of the algorithm, ensuring that it provides accurate and efficient solutions to the puzzle.

Overall, each team member made significant contributions to the project, and their contributions complemented each other's strengths. Jett's focus on the heuristic function and the Puzzle game's functionality, Rafael's work on the node structure and priority queue, and Rayyan's optimization of the A\* search algorithms and finding resources all played critical roles in the project's success. The team worked together equally, and their collaboration and communication were key to the project's successful completion.

**References:**

- Lecture Slides SCP#5 on canvas
- CS 4346 Project #2 Spring 2023.doc on canvas
- GeeksforGeeks. (2023, March 8). A\* search algorithm. GeeksforGeeks.  
Retrieved April 2, 2023, from <https://www.geeksforgeeks.org/a-search-algorithm/>