

Introduction to Artificial Intelligence: Local Search

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September 21, 2017

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Introduction to the Graphical User Interface(GUI)

When the Graphical User Interface starts up the user is able to select the type of puzzle evaluation through a drop down menu. The given options include: Basic Puzzle Evaluation, User Generated Puzzle Evaluation, Basic Hill Climbing, Hill Climbing with Random Restarts, Hill Climbing with Random Walk, Simulated Annealing, and Population Based Approach.

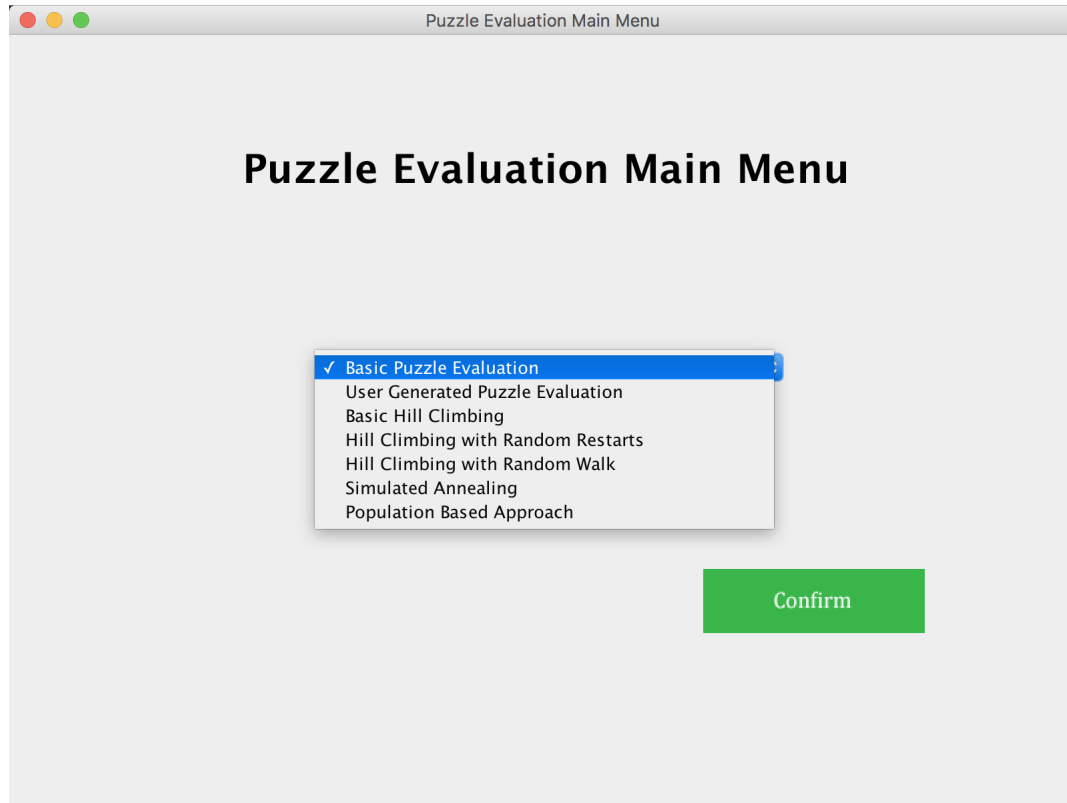


Figure 1: Main Menu of GUI

Each of the options then have their own corresponding window which is comprised of four main tabs: Puzzle Initialization, Puzzle, Puzzle Moves, and Puzzle Data. The Puzzle Initialization tab is slightly different for each option in regards to the type of input received. The tabs Puzzle and Puzzle moves provide the user with a graphical representation of the generated puzzle as well as a graphical representation of the number of moves that it takes to get to each cell respectively.

Basic Puzzle Evaluation

The Basic Puzzle Evaluation creates a randomly generated puzzle that contains only legal moves. The Basic Puzzle Evaluation window asks the user to provide a size n for the puzzle, where n can take on the values 5, 7, 9, and 11. They are then able to generate the puzzle by clicking the generate button. Each time generate is selected a random puzzle of the selected size is generated.

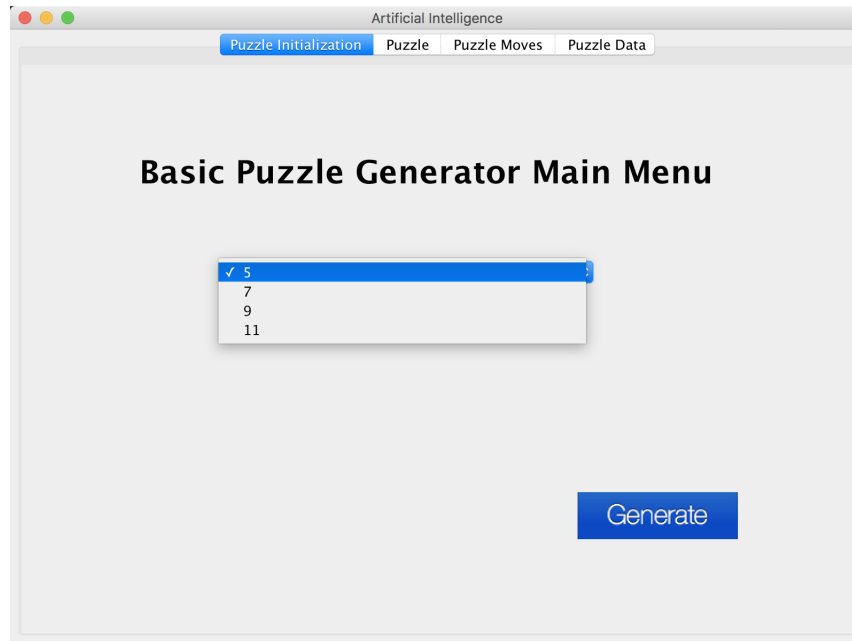


Figure 2: Puzzle Initialization of Basic Puzzle Evaluation Option

Artificial Intelligence

Puzzle Initialization

Puzzle

Puzzle Moves

Puzzle Data

2	2	1	2	2
3	2	3	3	3
2	3	1	1	2
4	1	1	1	3
1	1	1	1	G

Figure 3: Puzzle Tab of Basic Evaluation

Artificial Intelligence

Puzzle InitializationPuzzlePuzzle MovesPuzzle Data

0	2	1	2	5
5	X	2	4	X
1	3	2	3	4
3	4	3	4	4
2	3	3	4	5

Figure 4: Puzzle Moves Tab of Basic Evaluation

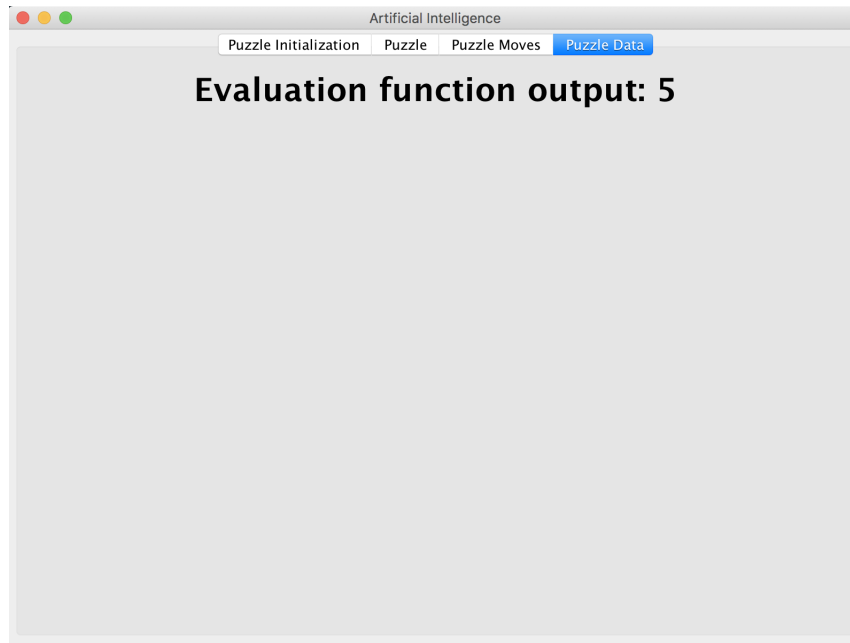


Figure 5: Puzzle Data Tab of Basic Evaluation

User Generated Puzzle Evaluation

The User Puzzle Evaluation includes a text field where the user can input the filepath to a pregenerated puzzle for the program to solve. It will then visualize the puzzle, puzzle moves, and result of the evaluation function in the corresponding windows.

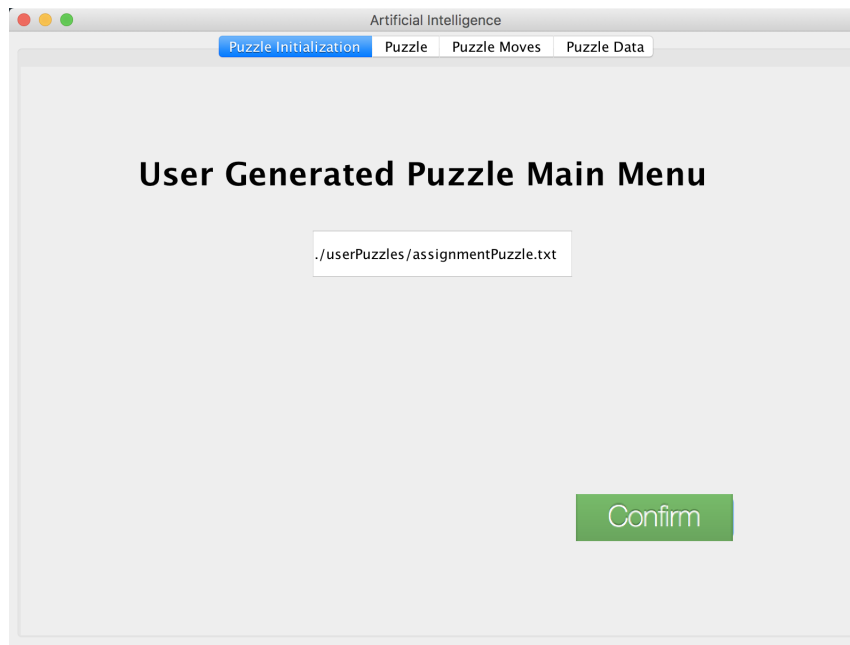


Figure 6: User Generated Puzzle Initialization

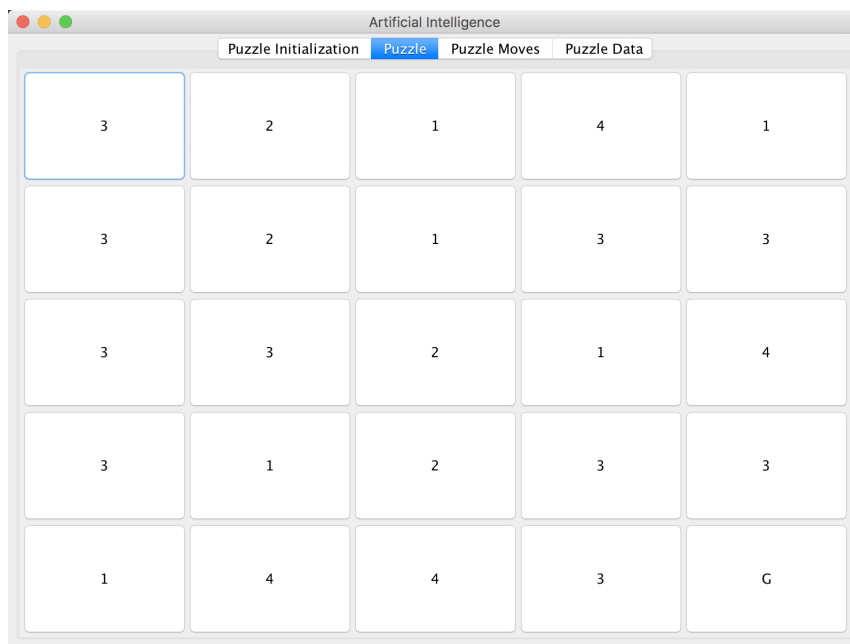


Figure 7: User Generated Puzzle

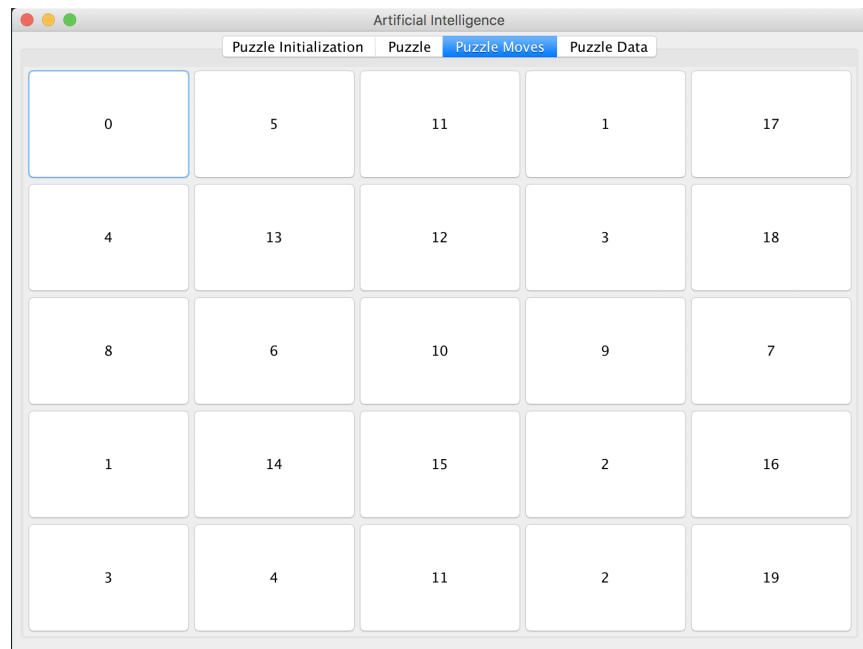


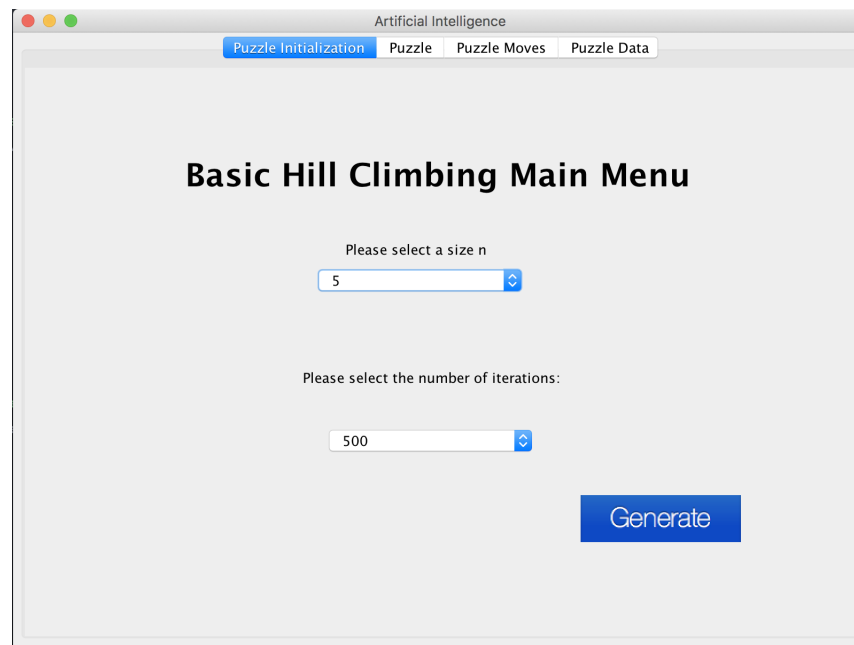
Figure 8: User Generated Puzzle Moves



Figure 9: User Generated Puzzle Evaluation

Basic Hill Climbing

The Basic Hill Climbing option similarly to the Basic Puzzle Evaluation option includes a box that allows the user to choose a puzzle size n , as well as an option that lets the user choose the desired number of iterations for the hill climbing algorithm. The puzzle and puzzle moves tabs remain unchanged. The puzzle data tab still includes the evaluation output and additionally gives the estimated amount of time the algorithm took to run in milliseconds.



The screenshot shows a web application window titled "Artificial Intelligence". It has four tabs: "Puzzle Initialization" (active), "Puzzle", "Puzzle Moves", and "Puzzle Data". The main content area is titled "Basic Hill Climbing Main Menu". It contains two dropdown menus. The first is labeled "Please select a size n" and has the value "5" selected. The second is labeled "Please select the number of iterations:" and has the value "500" selected. A blue "Generate" button is located at the bottom right of the form.

Figure 10: Basic Hill Climbing Puzzle Initialization

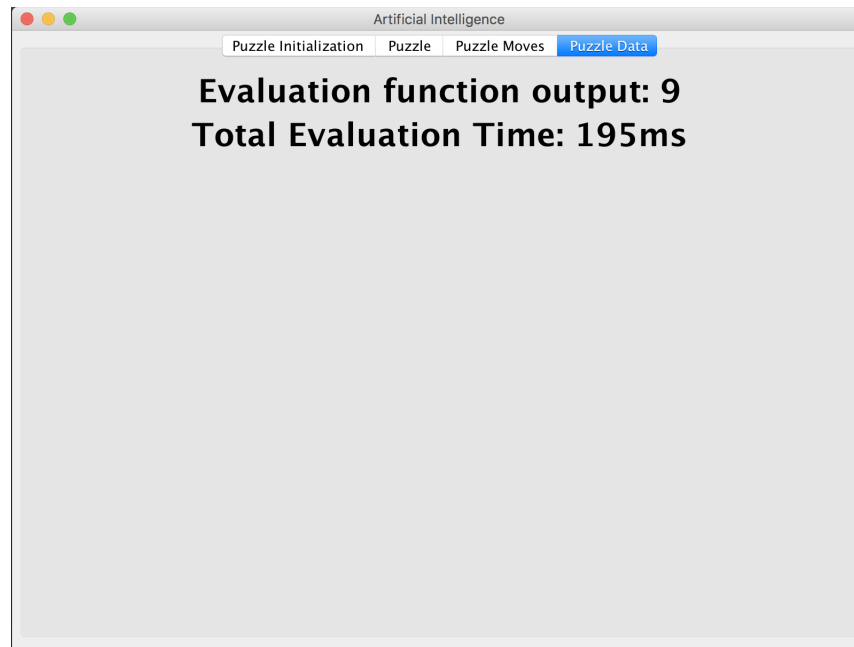


Figure 11: Basic Hill Climbing Puzzle Data Tab

Hill Climbing with Random Restarts

Hill Climbing with Random Walk

Simulated Annealing

Population Based Approach

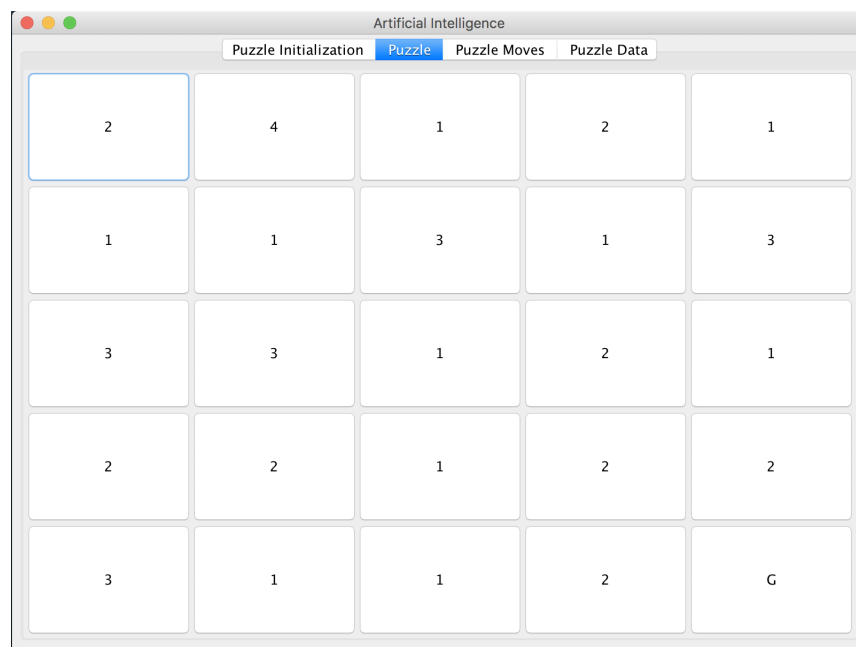
Puzzle Representation

The Graphical User Interface starts up and gives the user

Puzzle Evaluation

Example solvable and unsolvable puzzles for size $n = 5, 7, 9, 11$ are included below showing the Puzzle, Puzzle Moves, and Puzzle Data tabs for each case. The GUI shows the same type of output for the options Basic Puzzle Evaluation Puzzle and User Generated Puzzle Evaluation. Please see Figure 6 to Figure 9 for an example of a User Generated Puzzle.

Example Puzzle for $n = 5$



Artificial Intelligence				
Puzzle Initialization	Puzzle	Puzzle Moves	Puzzle Data	
2	4	1	2	1
1	1	3	1	3
3	3	1	2	1
2	2	1	2	2
3	1	1	2	G

Figure 12: Reachable Goal Puzzle size $n = 5$

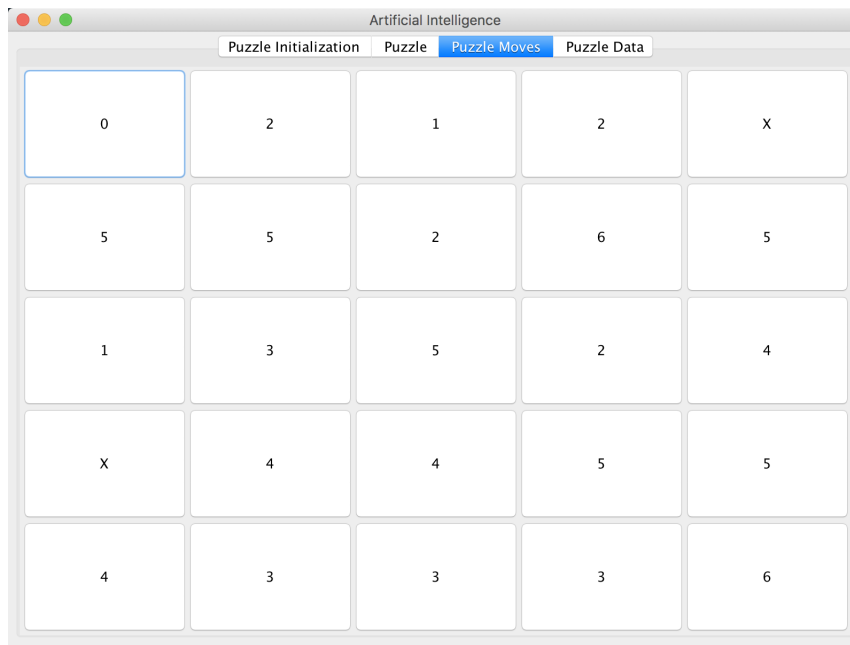


Figure 13: Reachable Goal Puzzle Moves size $n = 5$

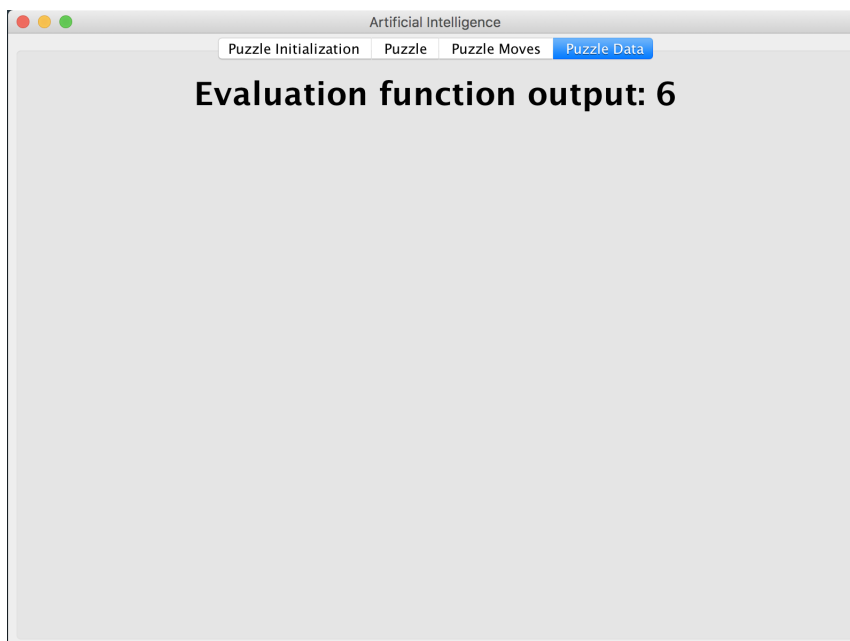


Figure 14: Reachable Goal Puzzle Evaluation size $n = 5$

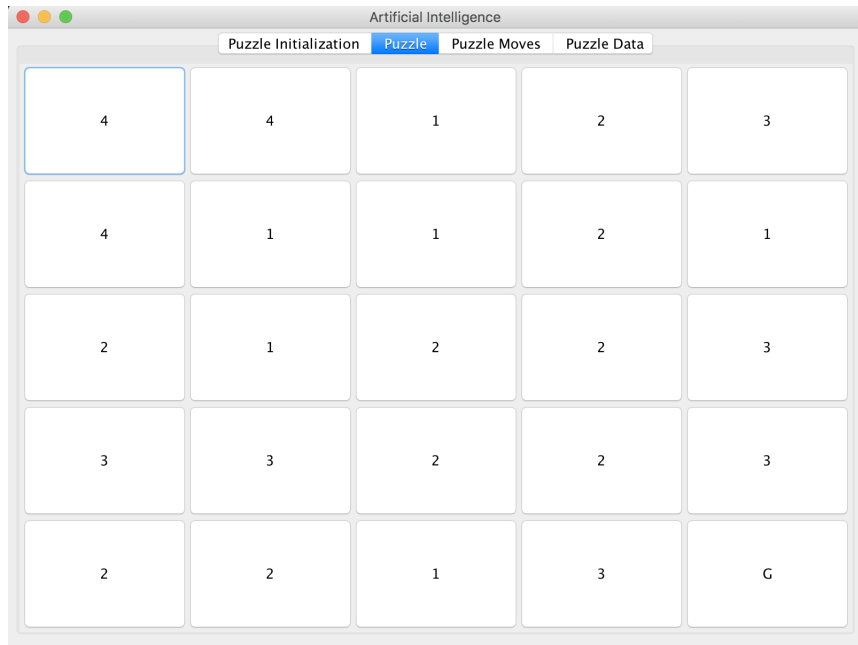


Figure 15: Unreachable Goal Puzzle size $n = 5$

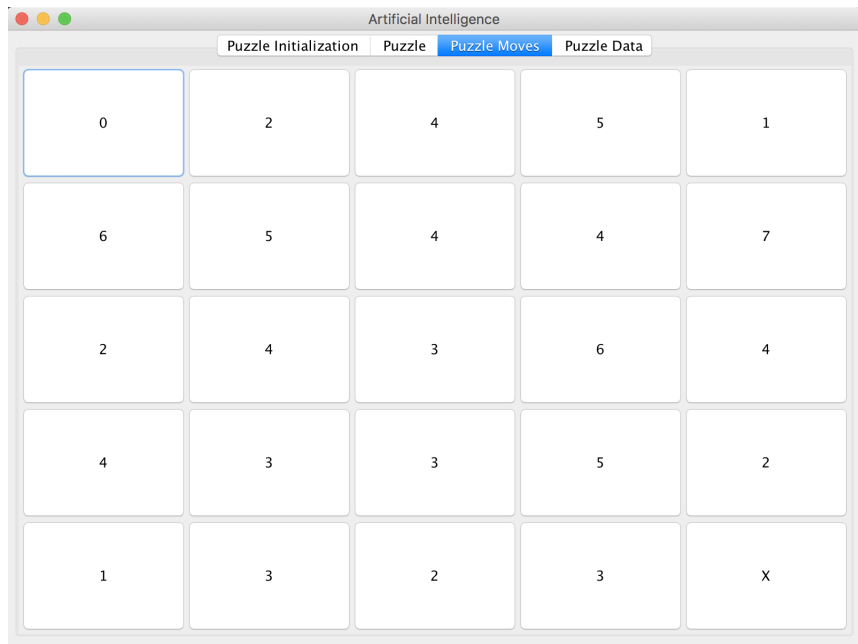


Figure 16: Unreachable Goal Puzzle Moves size $n = 5$

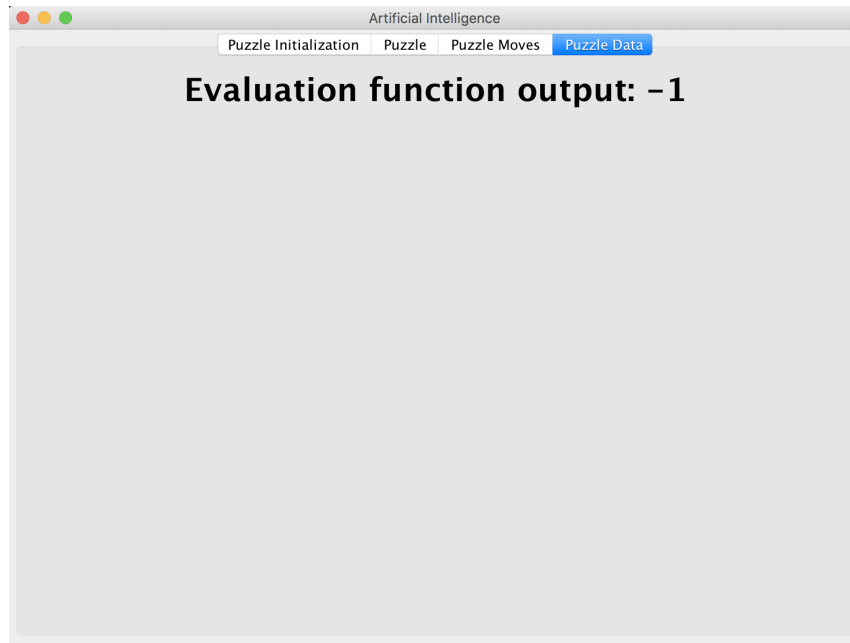


Figure 17: Unreachable Goal Puzzle Evaluation size $n = 5$

Example Puzzle for $n = 7$

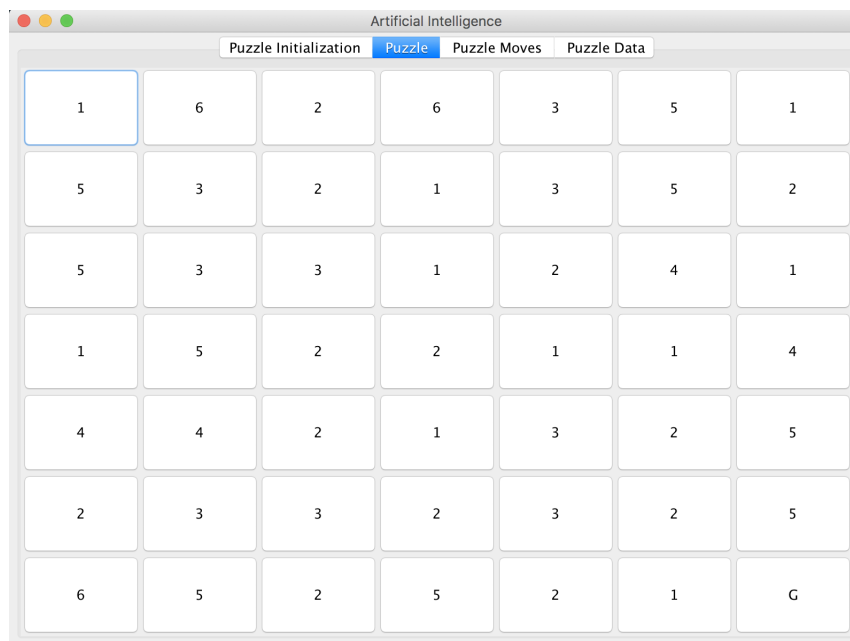


Figure 18: Reachable Goal Puzzle size $n = 7$

Artificial Intelligence

Puzzle Initialization Puzzle **Puzzle Moves** Puzzle Data

0	1	X	8	8	X	X
1	3	8	7	4	2	9
9	7	7	8	7	6	8
8	7	7	6	6	5	6
7	4	6	6	5	5	X
X	6	8	5	7	4	X
2	2	5	9	4	3	3

Figure 19: Reachable Goal Puzzle Moves size $n = 7$

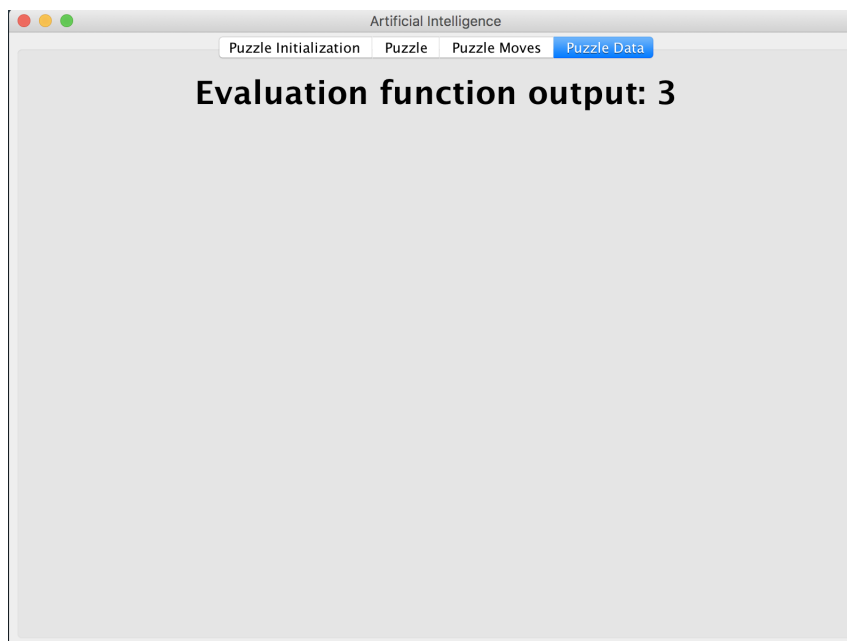


Figure 20: Reachable Goal Puzzle Evaluation size $n = 7$

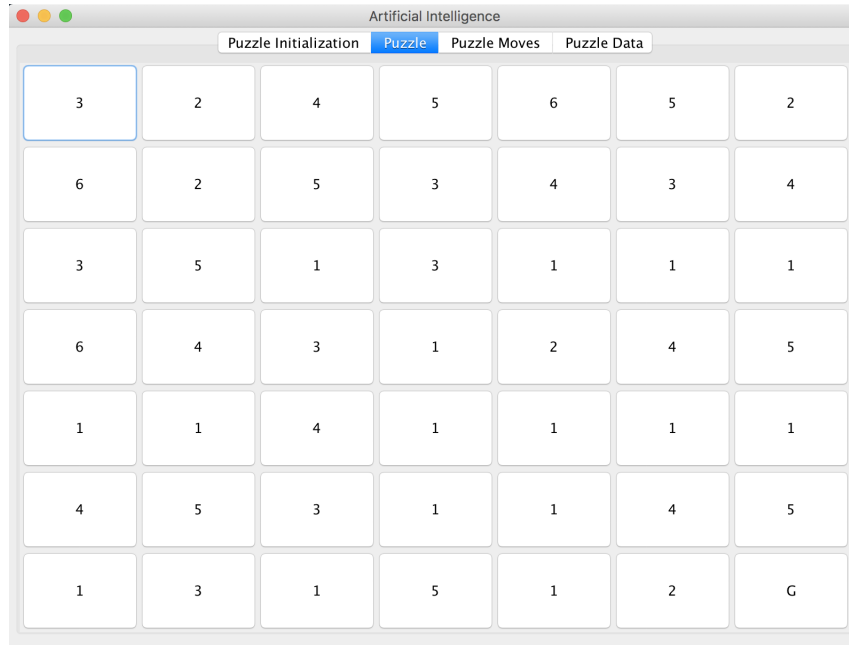


Figure 21: Unreachable Goal Puzzle size $n = 7$

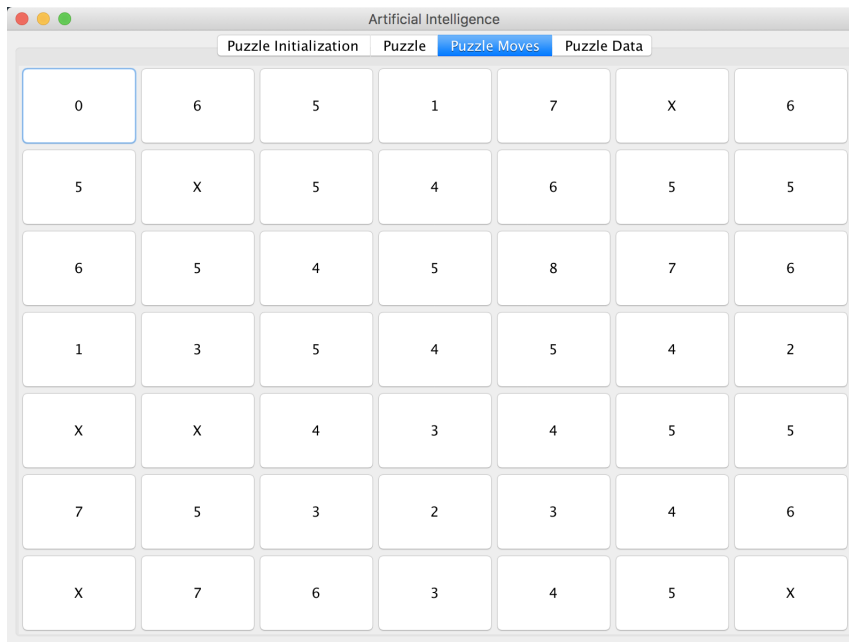


Figure 22: Unreachable Goal Puzzle Moves size $n = 7$

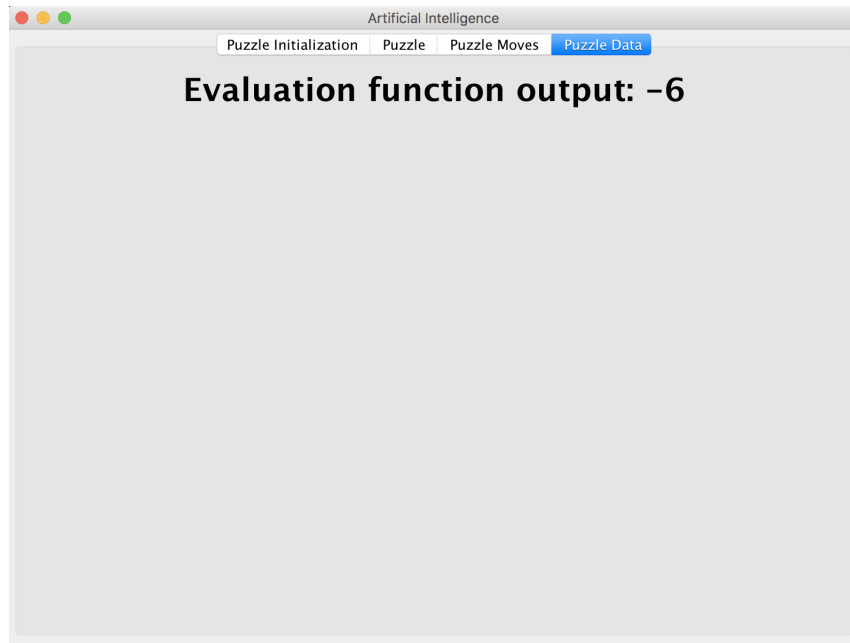


Figure 23: Unreachable Goal Puzzle Evaluation size $n = 7$

Example Puzzle for $n = 9$

The screenshot shows a window titled 'Artificial Intelligence' with four tabs: 'Puzzle Initialization', 'Puzzle', 'Puzzle Moves', and 'Puzzle Data'. The 'Puzzle' tab is selected. The main content area displays a 9x9 grid of numbers. The top-left cell (row 1, column 1) is highlighted with a blue border. The bottom-right cell (row 9, column 9) contains the letter 'G'.

5	7	6	7	7	6	3	2	7
5	4	2	6	7	5	7	3	6
4	5	1	3	3	6	6	5	6
2	7	6	5	2	3	1	4	3
2	4	3	4	1	1	4	6	3
4	6	5	2	3	3	3	6	2
4	4	3	4	2	3	1	4	1
2	7	5	1	6	3	1	1	7
7	3	7	7	6	3	5	2	G

Figure 24: Reachable Goal Puzzle size $n = 9$

Artificial Intelligence

Puzzle Initialization Puzzle Puzzle Moves Puzzle Data

0	6	9	7	X	1	8	X	5
2	X	6	8	7	3	X	X	X
4	4	5	6	3	8	5	4	X
X	X	4	7	6	3	7	8	4
X	8	8	6	5	6	7	7	X
1	3	8	6	2	7	5	3	4
3	X	3	5	4	2	5	4	3
X	5	8	7	8	7	6	5	4
X	7	8	7	3	7	6	6	8

Figure 25: Reachable Goal Puzzle Moves size $n = 9$

Artificial Intelligence

Puzzle Initialization Puzzle Puzzle Moves Puzzle Data

Evaluation function output: 8

Figure 26: Reachable Goal Puzzle Evaluation size $n = 9$

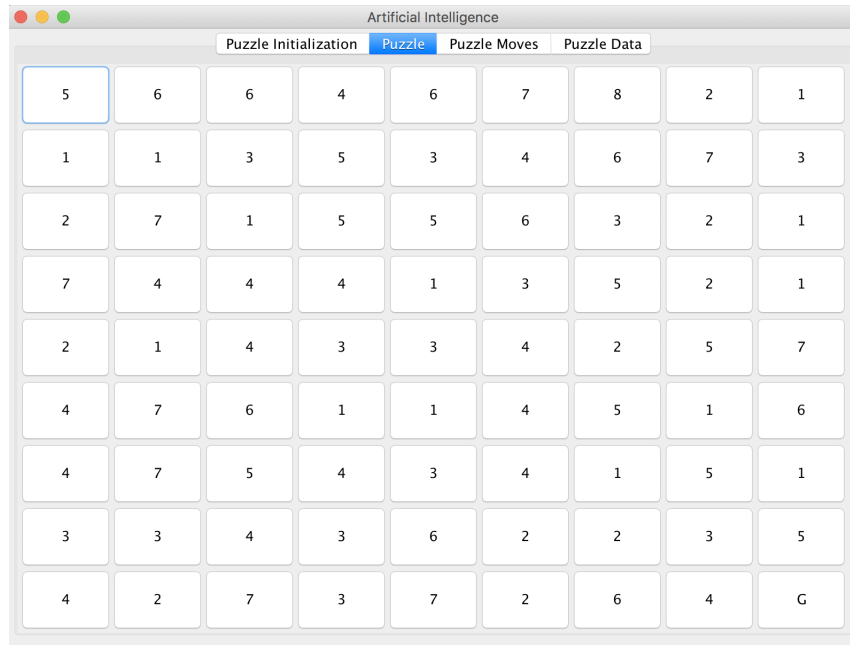


Figure 27: Unreachable Goal Puzzle size $n = 9$

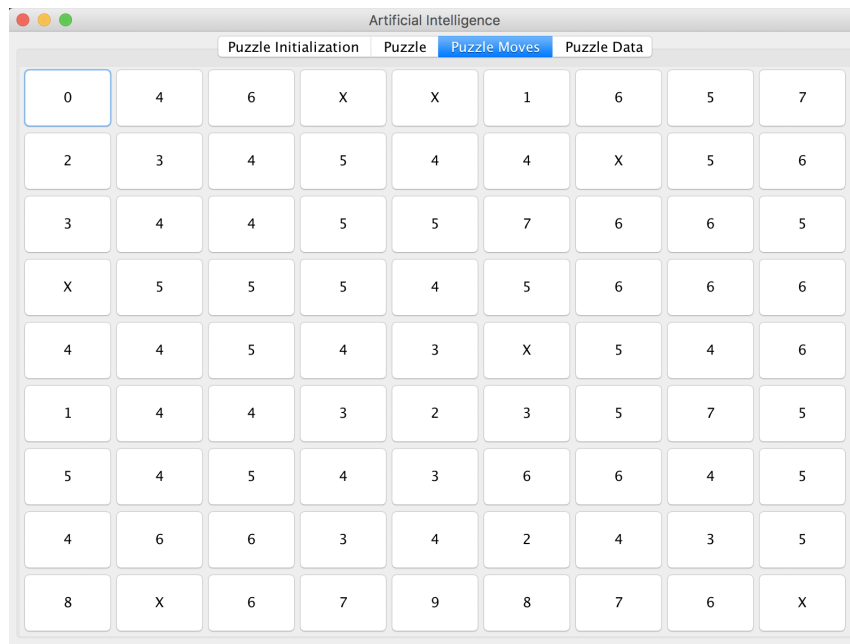


Figure 28: Unreachable Goal Puzzle Moves size $n = 9$

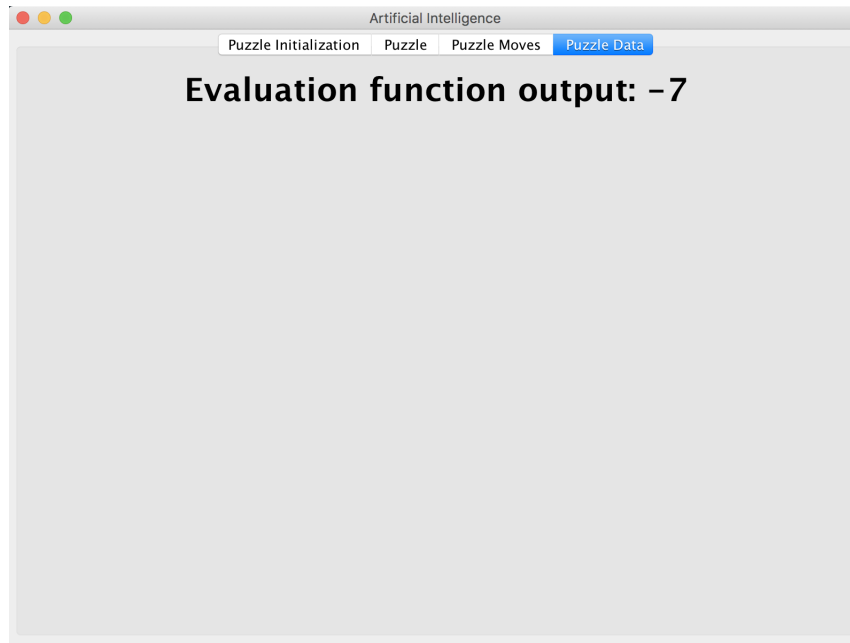


Figure 29: Unreachable Goal Puzzle Evaluation size $n = 9$

Example Puzzle for $n = 11$

The screenshot shows a window titled 'Artificial Intelligence' with four tabs: 'Puzzle Initialization', 'Puzzle', 'Puzzle Moves', and 'Puzzle Data'. The 'Puzzle' tab is selected and highlighted in blue. The main content area displays an 11x11 grid of numbers. The first cell (row 1, column 1) containing the number '1' is highlighted with a blue border.

1	6	3	8	9	1	1	4	8	1	5
7	5	4	9	8	6	6	3	8	9	8
1	3	1	3	6	6	8	8	6	1	3
3	8	8	2	4	4	5	7	6	8	3
7	6	5	2	5	3	3	5	7	6	9
9	8	6	4	4	1	1	6	2	3	4
4	3	5	3	1	5	2	3	2	7	5
9	5	2	4	2	6	4	5	7	4	6
8	8	3	2	1	2	3	2	3	1	8
1	6	7	1	2	2	3	1	6	3	2
4	2	7	7	8	9	2	4	8	3	G

Figure 30: Reachable Goal Puzzle size $n = 11$

0	1	X	3	10	9	10	2	6	X	8
1	X	4	6	3	5	5	2	X	8	3
6	7	6	7	8	X	8	9	8	7	8
7	3	6	5	X	6	6	7	5	4	7
X	8	4	7	X	7	6	3	7	7	X
5	7	5	6	4	6	5	6	4	6	5
5	2	8	4	3	4	5	6	6	7	5
6	6	5	X	4	6	5	X	5	7	5
2	5	8	4	9	4	6	5	3	6	7
X	3	5	5	4	X	5	4	5	6	4
6	9	X	5	7	5	9	5	10	8	6

Figure 31: Reachable Goal Puzzle Moves size $n = 11$

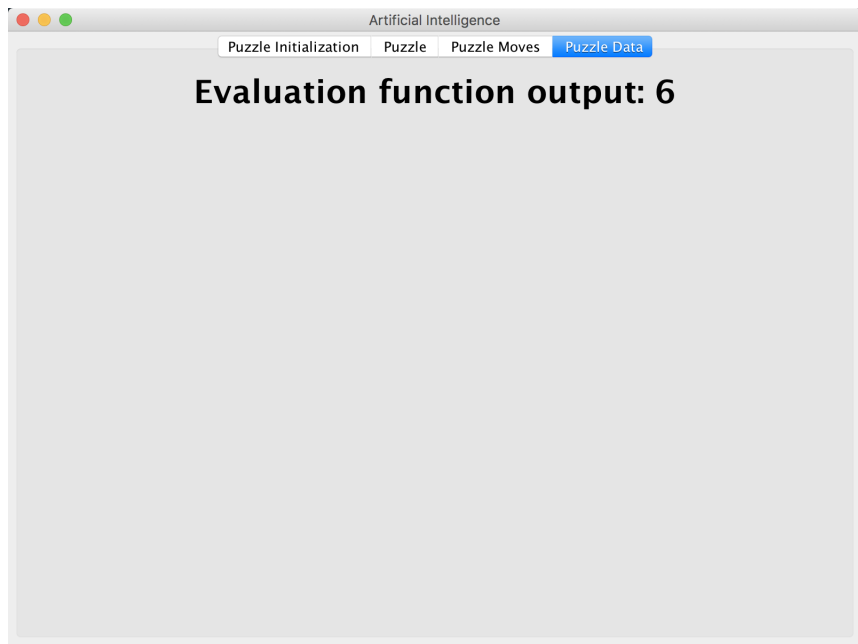


Figure 32: Reachable Goal Puzzle Evaluation size $n = 11$

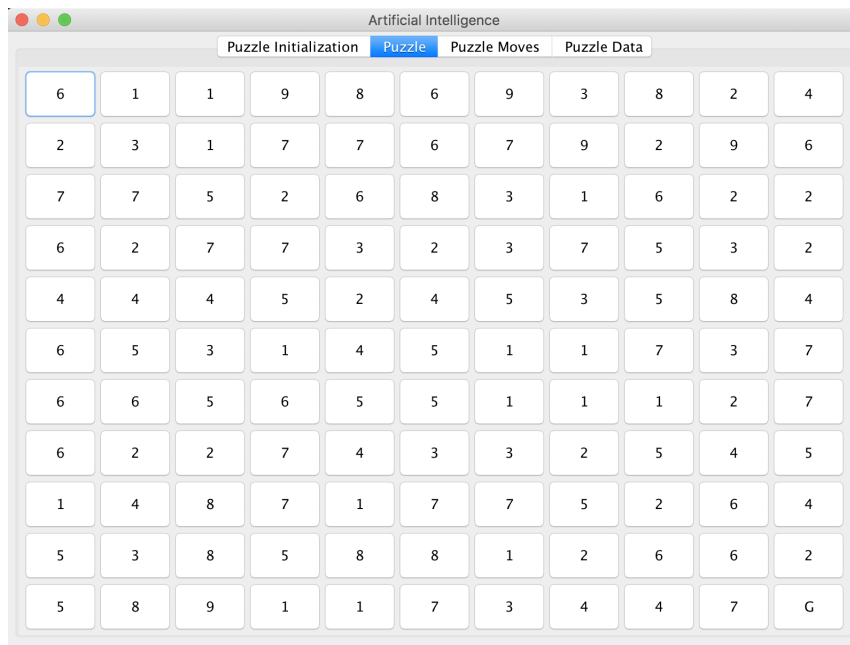


Figure 33: Unreachable Goal Puzzle size $n = 11$

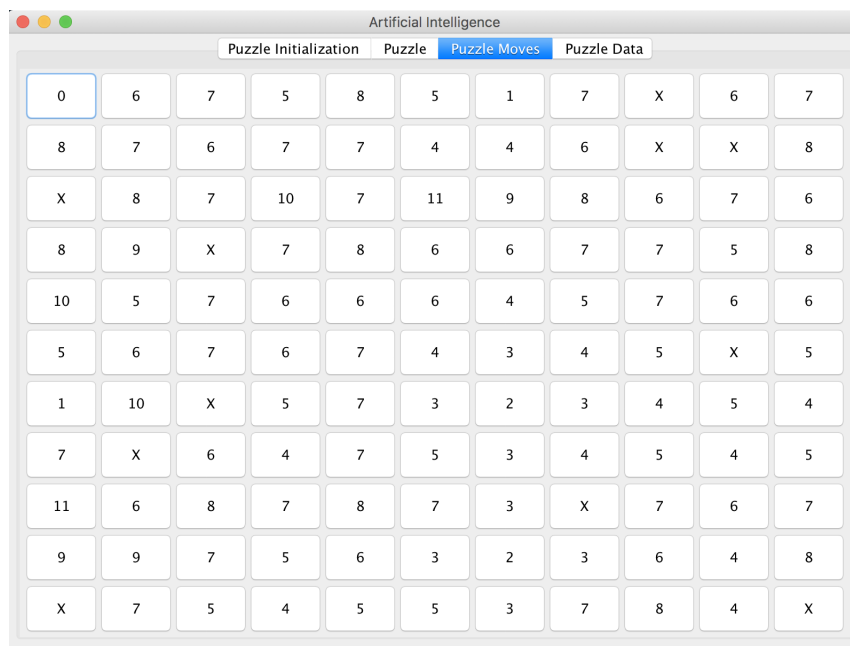


Figure 34: Unreachable Goal Puzzle Moves size $n = 11$

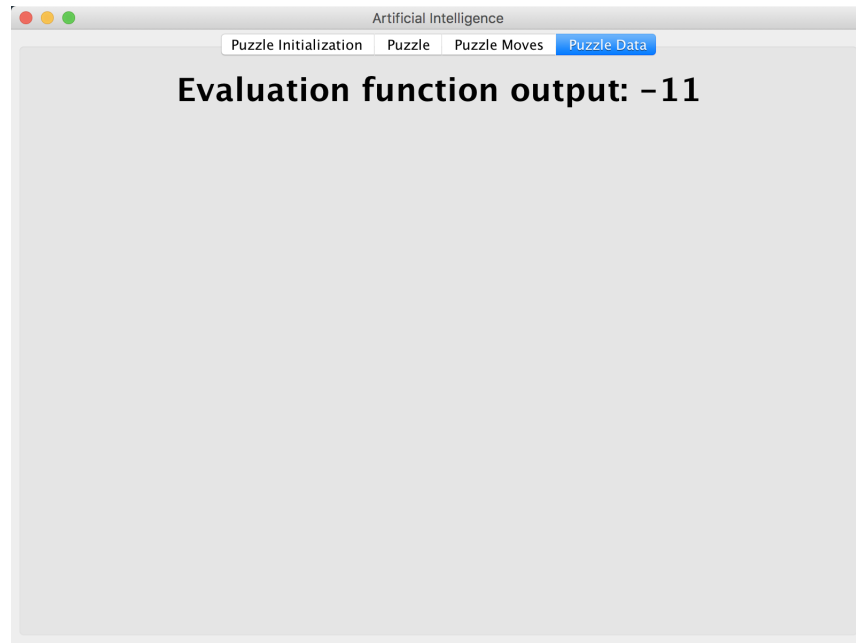


Figure 35: Unreachable Goal Puzzle Evaluation size $n = 11$

Basic Hill Climbing Approach

The Hill Climbing is able to create puzzles that are on average more difficult than the single random puzzle. One of the downfalls of this algorithm is that it tends to get stuck around extrema. This can be seen from the graphs that generally show the number of goal moves starting low-typical of the random puzzle-and then quickly going up and plateauing. These plateaus are occasionally surpassed although it typically takes many iterations.

Example Puzzle for $n = 5$

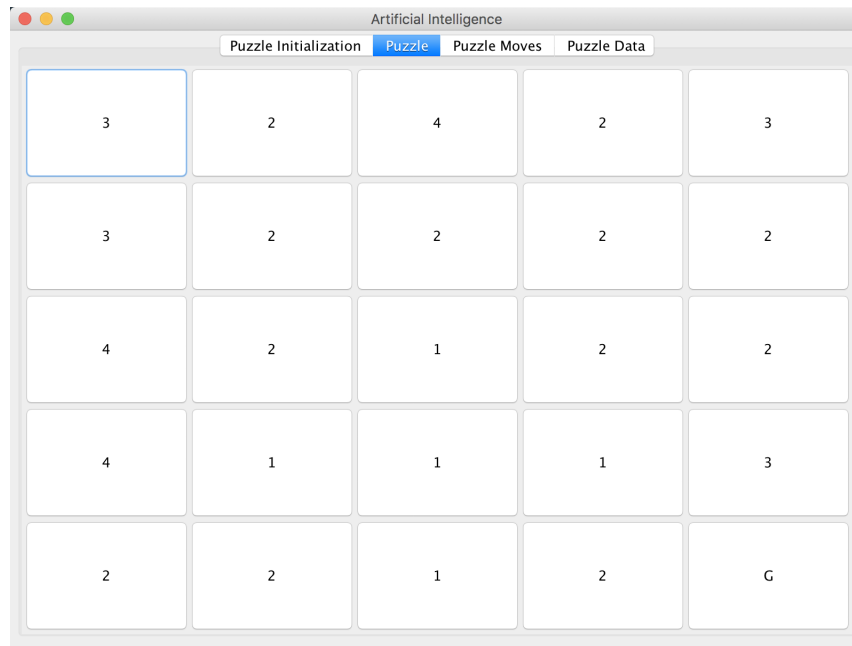


Figure 36: Basic Hill Climbing Puzzle for $n = 5$

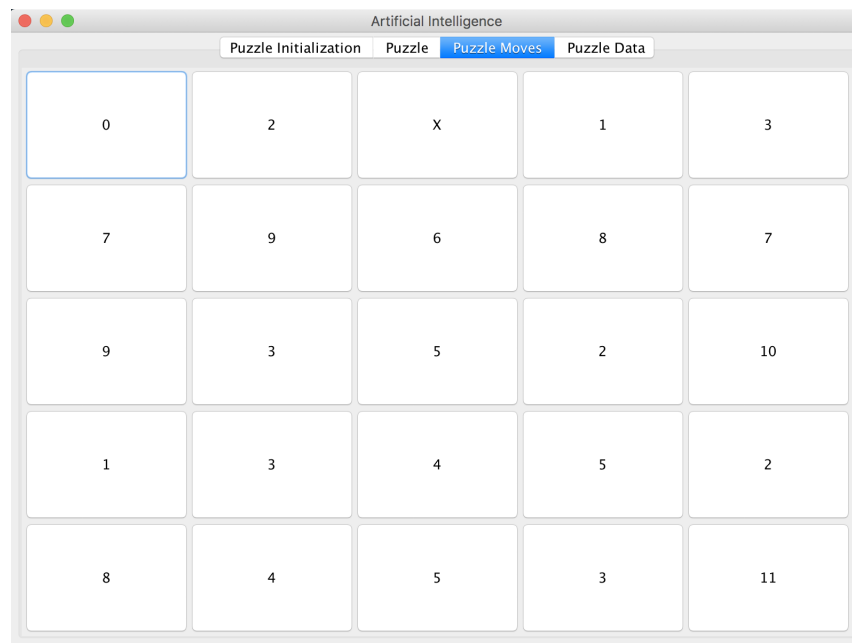


Figure 37: Basic Hill Climbing Puzzle Moves for $n = 5$

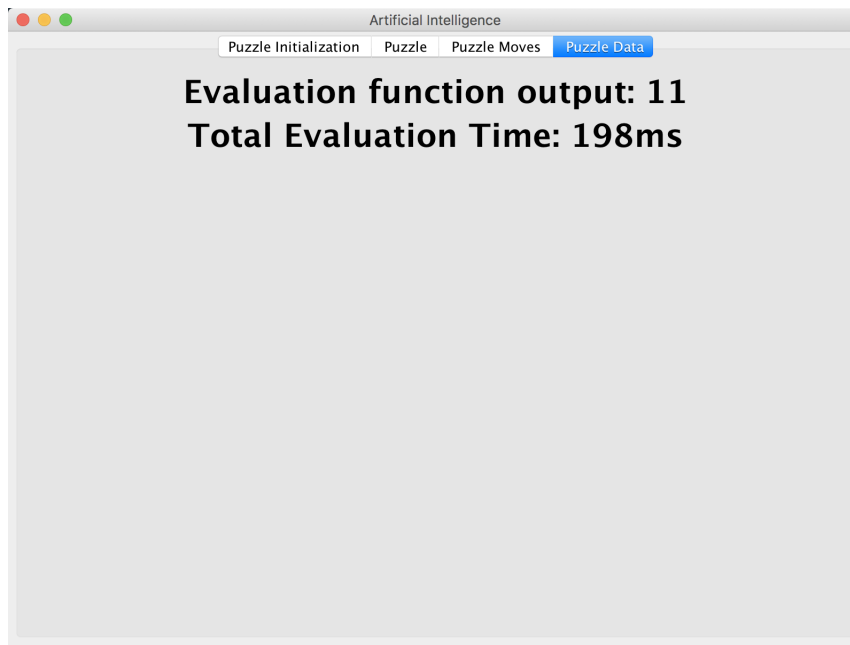


Figure 38: Basic Hill Climbing Puzzle Data for $n = 5$

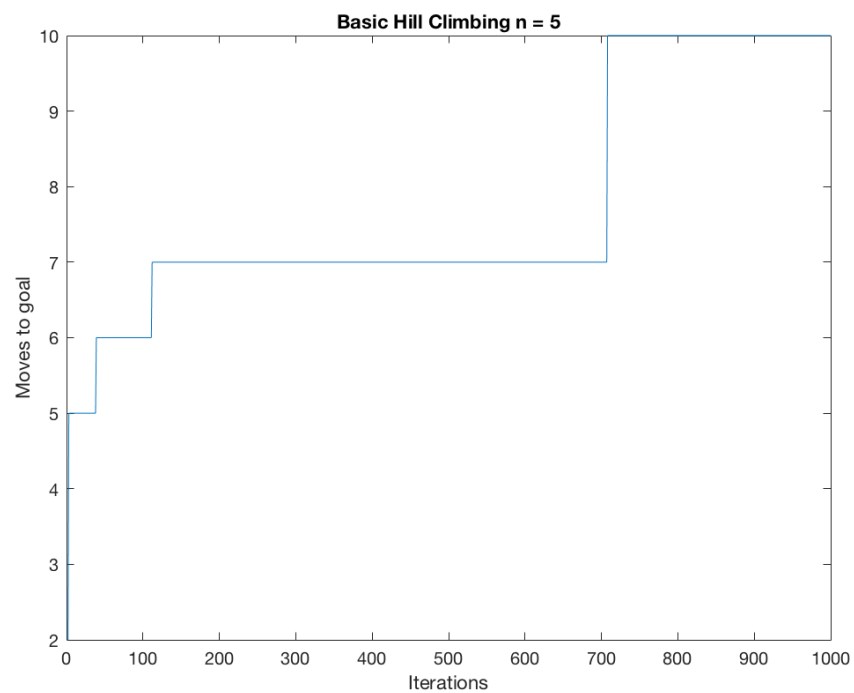
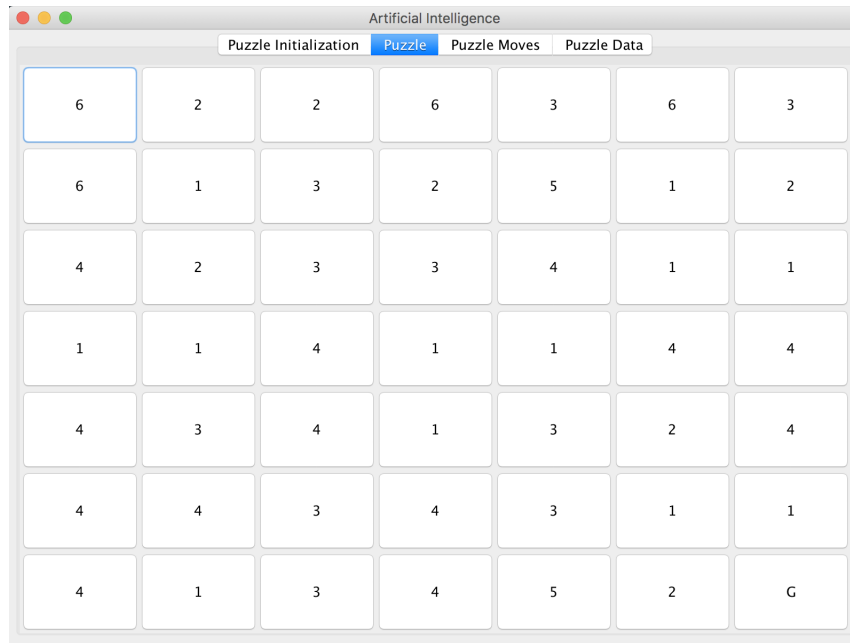


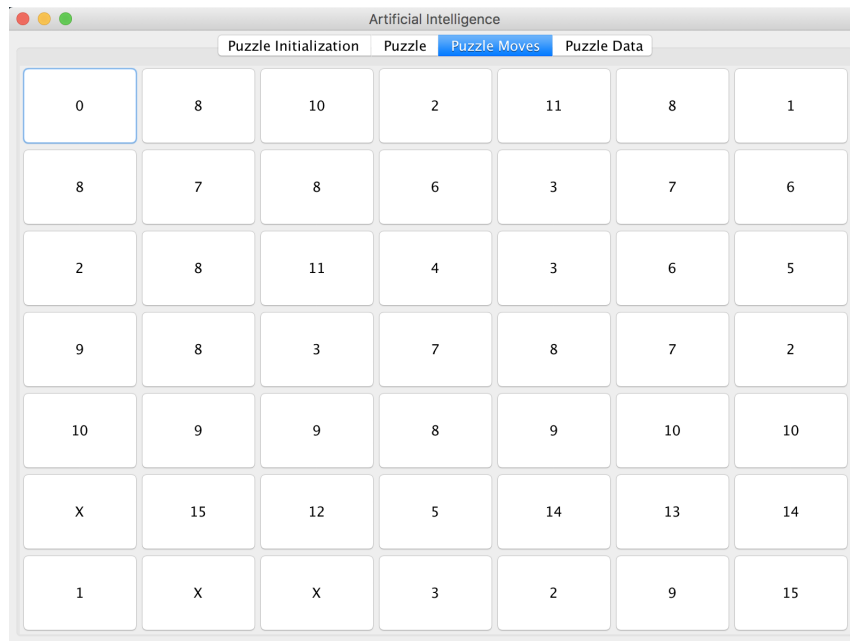
Figure 39: Plot of 1000 iterations of Hill Climbing for $n = 5$

Example Puzzle for $n = 7$



Artificial Intelligence						
Puzzle Initialization	Puzzle	Puzzle Moves	Puzzle Data			
6	2	2	6	3	6	3
6	1	3	2	5	1	2
4	2	3	3	4	1	1
1	1	4	1	1	4	4
4	3	4	1	3	2	4
4	4	3	4	3	1	1
4	1	3	4	5	2	G

Figure 40: Basic Hill Climbing Puzzle for $n = 7$



Artificial Intelligence						
Puzzle Initialization	Puzzle	Puzzle Moves	Puzzle Data			
0	8	10	2	11	8	1
8	7	8	6	3	7	6
2	8	11	4	3	6	5
9	8	3	7	8	7	2
10	9	9	8	9	10	10
X	15	12	5	14	13	14
1	X	X	3	2	9	15

Figure 41: Basic Hill Climbing Puzzle Moves for $n = 7$

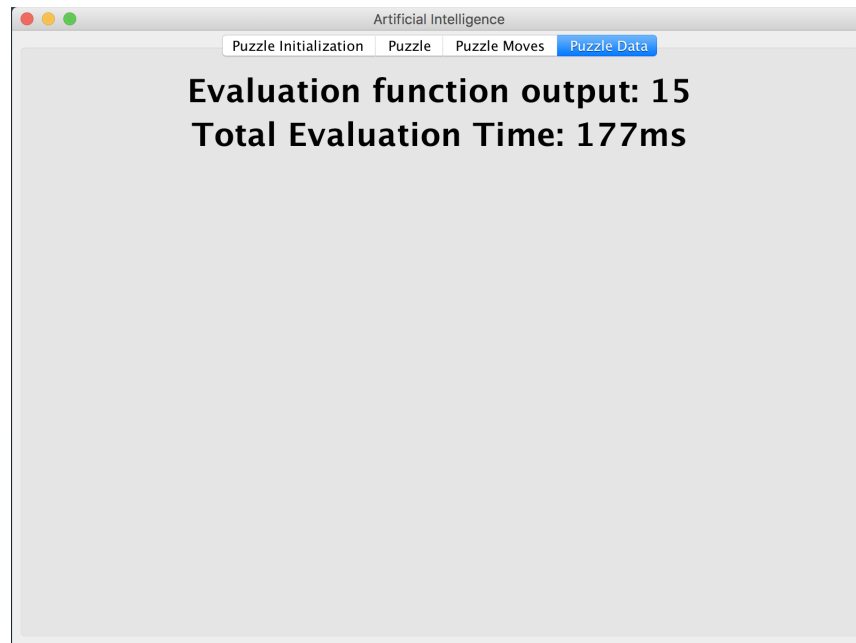


Figure 42: Basic Hill Climbing Puzzle Data for $n = 7$

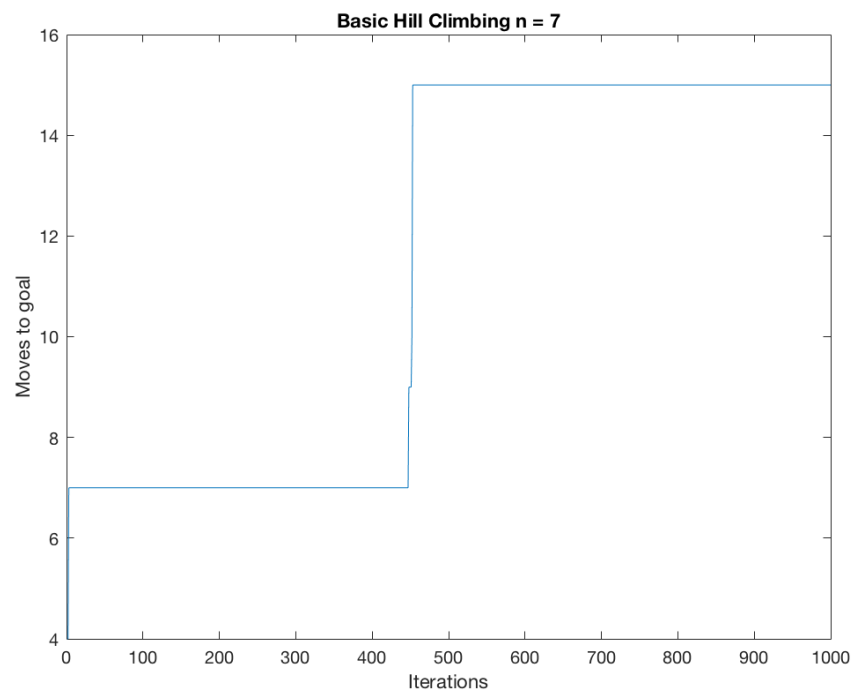
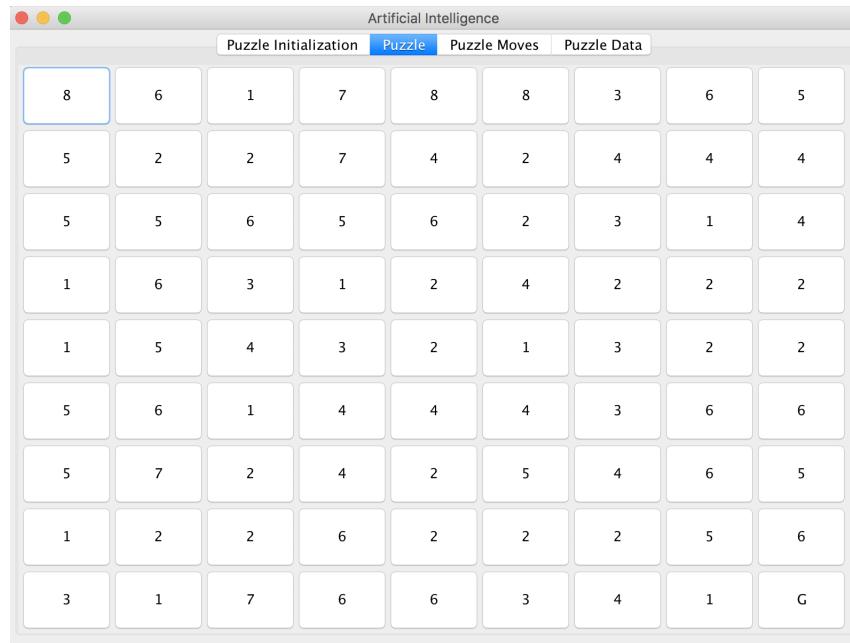


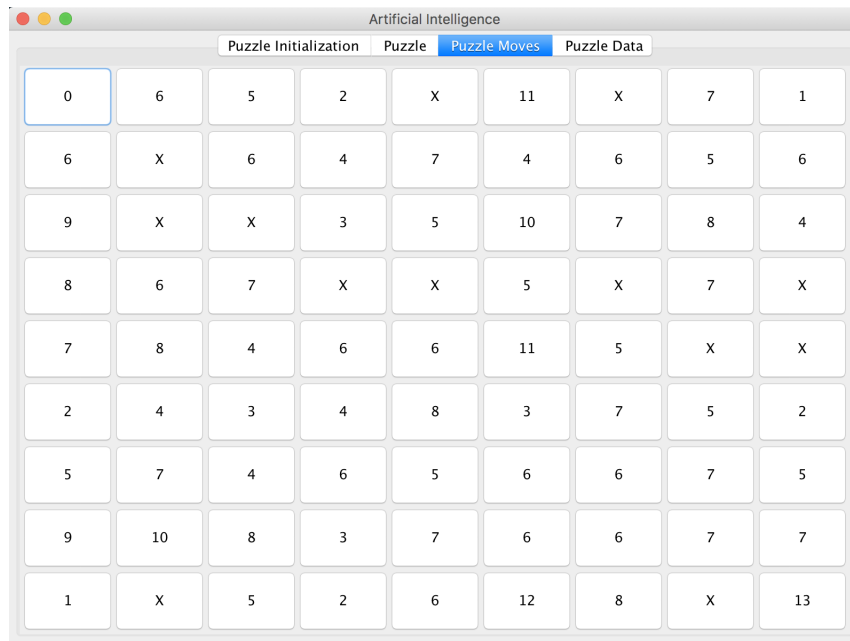
Figure 43: Plot of 1000 iterations of Hill Climbing for $n = 7$

Example Puzzle for $n = 9$



Artificial Intelligence								
Puzzle Initialization	Puzzle	Puzzle Moves	Puzzle Data					
8	6	1	7	8	8	3	6	5
5	2	2	7	4	2	4	4	4
5	5	6	5	6	2	3	1	4
1	6	3	1	2	4	2	2	2
1	5	4	3	2	1	3	2	2
5	6	1	4	4	4	3	6	6
5	7	2	4	2	5	4	6	5
1	2	2	6	2	2	2	5	6
3	1	7	6	6	3	4	1	G

Figure 44: Basic Hill Climbing Puzzle for $n = 9$



Artificial Intelligence								
Puzzle Initialization	Puzzle	Puzzle Moves	Puzzle Data					
0	6	5	2	X	11	X	7	1
6	X	6	4	7	4	6	5	6
9	X	X	3	5	10	7	8	4
8	6	7	X	X	5	X	7	X
7	8	4	6	6	11	5	X	X
2	4	3	4	8	3	7	5	2
5	7	4	6	5	6	6	7	5
9	10	8	3	7	6	6	7	7
1	X	5	2	6	12	8	X	13

Figure 45: Basic Hill Climbing Puzzle Moves for $n = 9$

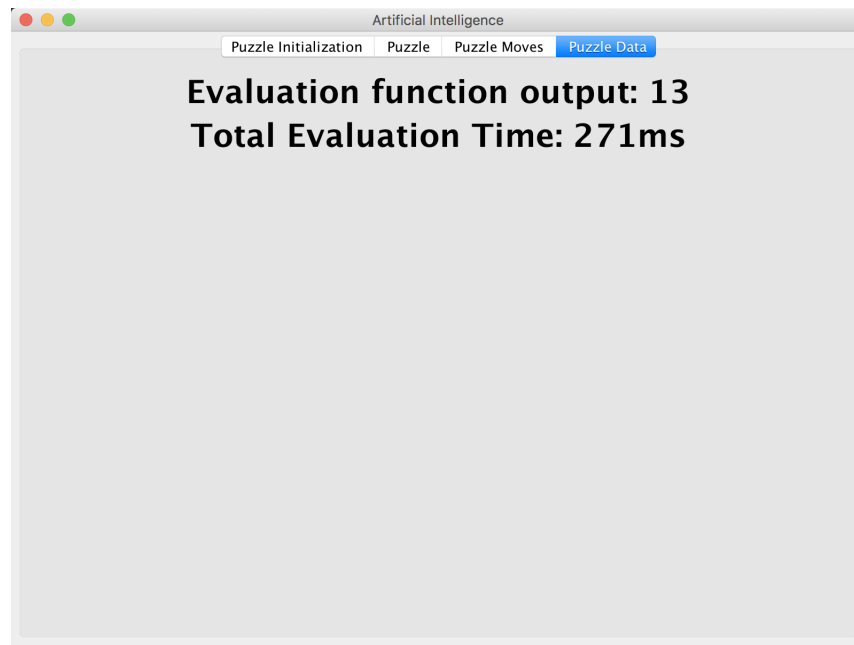


Figure 46: Basic Hill Climbing Puzzle Data for $n = 9$

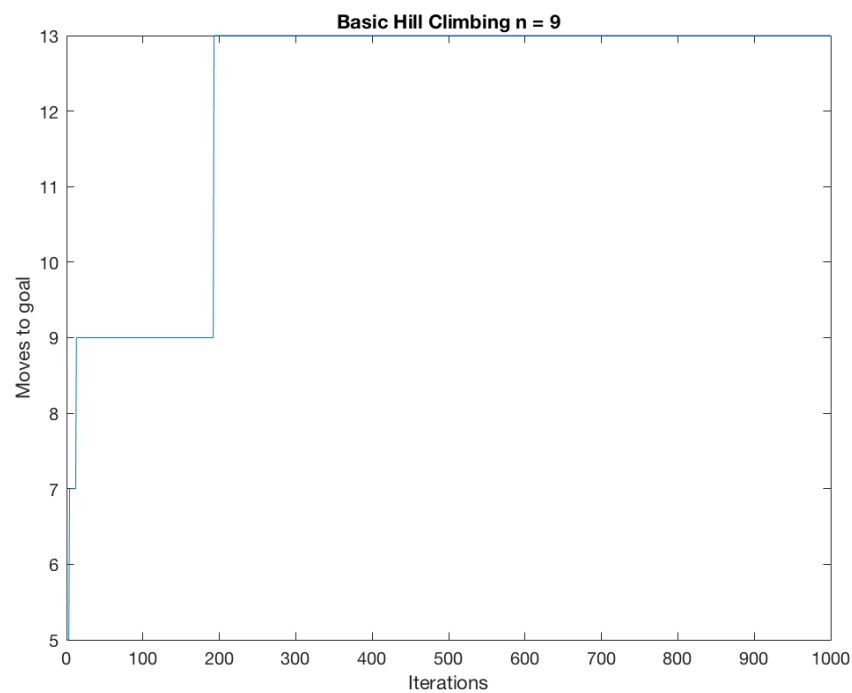
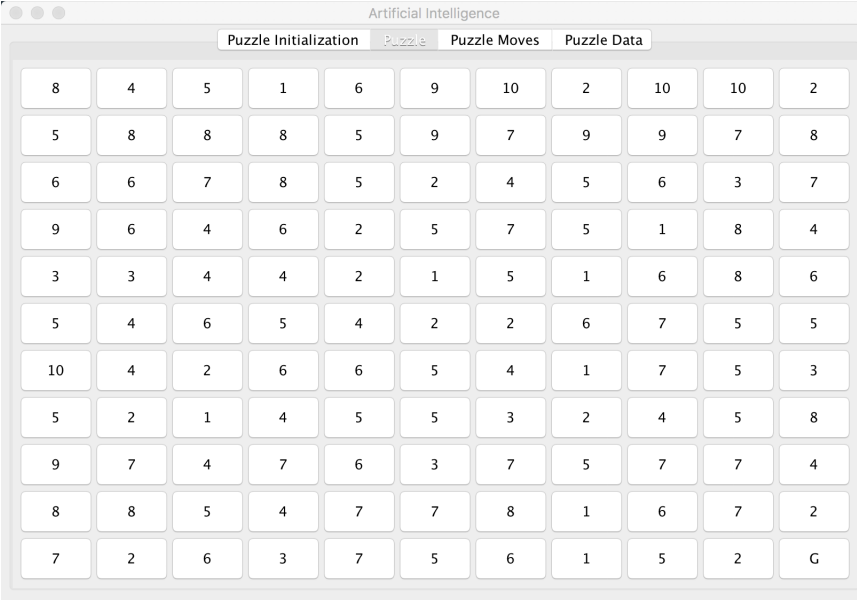


Figure 47: Plot of 1000 iterations of Hill Climbing for $n = 9$

Example Puzzle for $n = 11$

The first example is a "lucky" puzzle that started at a high number of moves. This is perhaps the best demonstration one of the problems of the stochastic hill climbing process. It shows how it can get stuck even after 1000 iterations in a local extrema. The run time is consequently much faster for this first puzzle as well since no other puzzles were found. The second puzzle also gets stuck at an extrema of 13 after 300 iterations that then lasts for 700 iterations.



Artificial Intelligence										
Puzzle Initialization				Puzzle			Puzzle Moves		Puzzle Data	
8	4	5	1	6	9	10	2	10	10	2
5	8	8	8	5	9	7	9	9	7	8
6	6	7	8	5	2	4	5	6	3	7
9	6	4	6	2	5	7	5	1	8	4
3	3	4	4	2	1	5	1	6	8	6
5	4	6	5	4	2	2	6	7	5	5
10	4	2	6	6	5	4	1	7	5	3
5	2	1	4	5	5	3	2	4	5	8
9	7	4	7	6	3	7	5	7	7	4
8	8	5	4	7	7	8	1	6	7	2
7	2	6	3	7	5	6	1	5	2	G

Figure 48: Basic Hill Climbing Puzzle for $n = 11$

0	X	5	7	8	7	X	6	1	7	9
X	5	4	8	10	14	5	X	9	3	5
8	13	8	8	8	7	8	7	9	7	9
5	7	9	5	X	6	8	8	8	6	7
X	6	4	X	7	8	5	X	9	X	X
10	4	6	6	9	5	X	6	3	8	X
10	12	9	X	8	13	9	10	11	X	9
7	7	8	4	7	6	X	5	X	6	7
1	9	3	X	X	7	4	7	8	2	X
X	5	5	6	10	8	6	6	7	6	6
4	13	X	3	X	15	4	5	2	8	16

Figure 49: Basic Hill Climbing Puzzle Moves for $n = 11$

Evaluation function output: 16
Total Evaluation Time: 84ms

Figure 50: Basic Hill Climbing Puzzle Data for $n = 11$

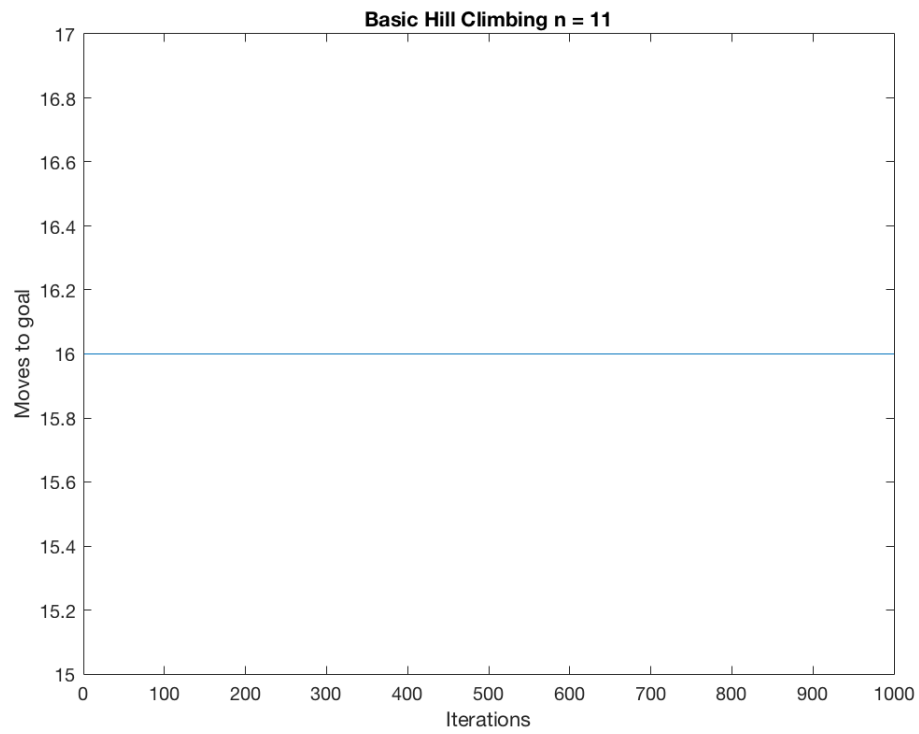


Figure 51: Plot of 1000 iterations of Hill Climbing for $n = 11$ of the first puzzle

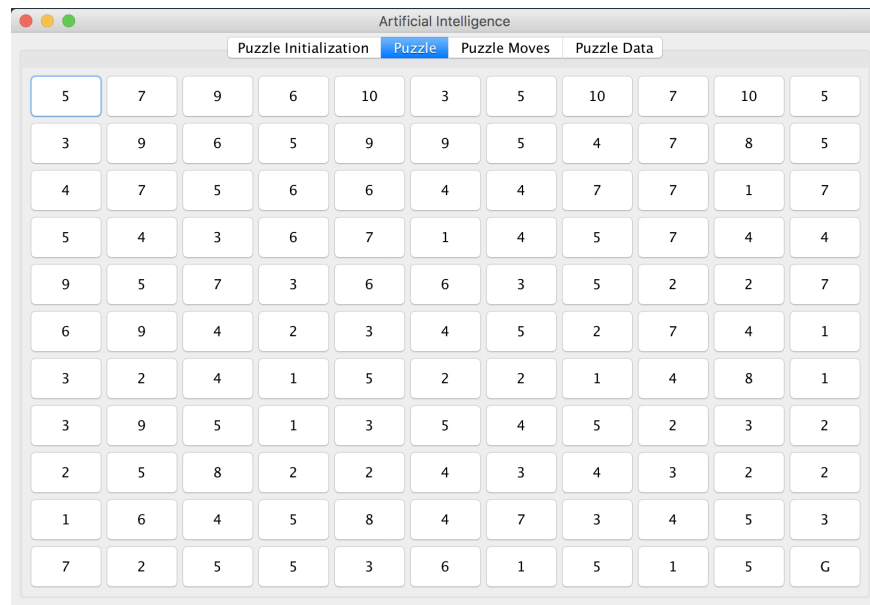


Figure 52: Basic Hill Climbing Puzzle 2 for $n = 11$

0	3	2	X	X	1	3	X	2	X	X
X	6	5	7	6	7	8	X	6	5	7
8	4	6	6	9	3	5	7	5	4	5
10	6	4	7	3	2	3	6	X	5	4
7	8	9	6	6	3	7	8	X	7	5
1	3	4	6	X	6	2	5	4	5	4
9	7	5	5	6	4	6	5	6	6	5
X	4	5	6	5	X	4	6	3	6	4
11	6	11	7	10	5	7	7	7	6	12
10	5	3	8	5	7	4	6	4	6	5
11	5	5	6	4	4	3	4	7	7	13

Figure 53: Basic Hill Climbing Puzzle 2 Moves for $n = 11$

Evaluation function output: 13
Total Evaluation Time: 1146ms

Figure 54: Basic Hill Climbing Puzzle 2 Data for $n = 11$

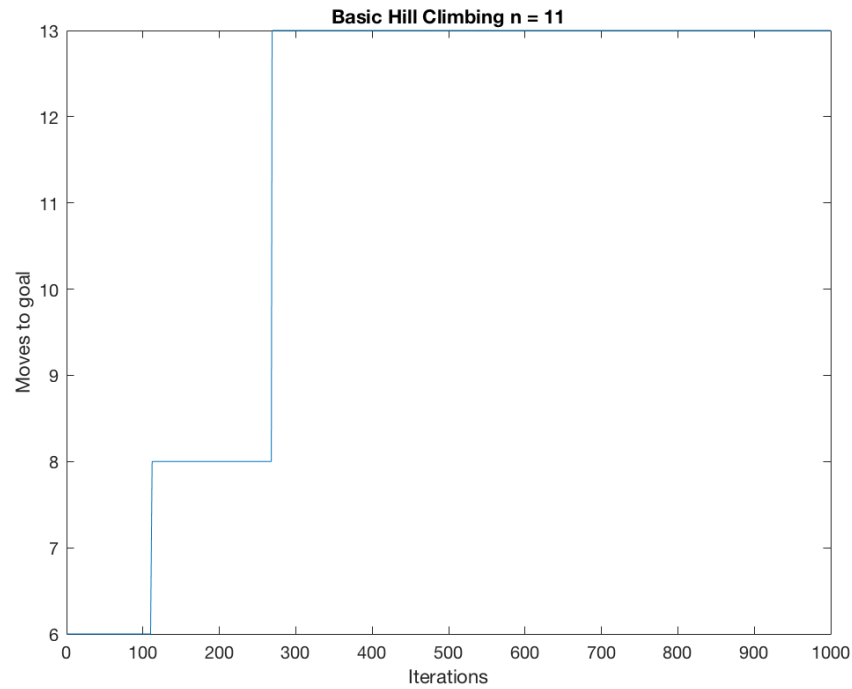


Figure 55: Plot of 1000 iterations of Hill Climbing for $n = 11$ of the second puzzle

Hill Climbing with Random Restarts

Your input in this case should be two numbers a) the number of times you will start a hill climbing process and b) the number of iterations per hill climbing process.

Example Puzzle for $n = 5$

IMAGES

Example Puzzle for $n = 7$

IMAGES

Example Puzzle for $n = 9$

IMAGES

Example Puzzle for $n = 11$

IMAGES

Hill Climbing with Random Walks

Compare the output of the above two processes against the one that utilizes random walks for the same number of total iterations. i.e. again again visualize the final optimized puzzle configuration, its value and time it took to compute it.

Your input in this case will be two numbers a) the total number of iterations for hill climbing and b) the probability of the acceptance of a downhill move

Evaluate the effects of different values for probability p and select the one that works best for this problem and preferred number of total iterations

Example Puzzle for $n = 5$

IMAGES

Example Puzzle for $n = 7$

IMAGES

Example Puzzle for $n = 9$

IMAGES

Example Puzzle for $n = 11$

IMAGES

Simulated Annealing

Proposal and Implementation of a population based approach