

# Artificial Intelligence 1

## Lab 2: Local and Adversarial Search

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### **Programming assignments**

#### **Exercise 1: N-queens problem**

##### **Hill climbing**

##### **Problem analysis**

For hill climbing we need to make a board so we can see the amount of attacking pairs for each position we can move a queen to. Then we need to determine the lowest value of this board and move our queen to this value. We keep doing this until we cannot find a value lower than the current value.

##### **Program design**

We make a matrix with at each index the amount of conflicts if we move the queen in that column to that index. We then determine the minimum value of this matrix. If there are multiple indexes with this value, we choose a random one. Once the index has been chosen, we move the queen in the corresponding column to this index. Then we update the matrix with the new configuration and keep repeating this process.

##### **Program extension**

The program can get stuck at plateaus. To fix this, we allow a certain amount of sideways steps. This way the program will not get stuck on most plateaus.

## Program evaluation

For each of these we used 5000 iterations:

**n = 12**

output: correct solution  
real 0m5.543s  
user 0m0.007s  
sys 0m0.000s

**n= 25**

output: correct solution  
real 0m3.171s  
user 0m0.129s  
sys 0m0.000s

**n = 99**

output: correct solution  
real 0m43.710s  
user 0m41.502s  
sys 0m0.000s

**valgrind for n=25:**

```
==2623==  
==2623== HEAP SUMMARY:  
==2623== in use at exit: 0 bytes in 0 blocks  
==2623== total heap usage: 28 allocs, 28 frees, 4,748 bytes allocated  
==2623==  
==2623== All heap blocks were freed – no leaks are possible  
==2623==  
==2623== For counts of detected and suppressed errors, rerun with: -v  
==2623== ERROR SUMMARY: 0 errors from 0 contexts (suppressed: 0 from 0)
```

## Questions

1. If we run the hill climbing program several times using different amounts of queens, most of the time it doesn't find a solution.
2. The hill climbing fails because it can get stuck at two different points. If the program finds a local minimum it does not look any further and if the program hits a plateau it will also stop.

3. We can fix our algorithm so that it will not get stuck on a plateau by adding the ability to do a certain amount of sidesteps.
4. The bold numbers are the amount of queens, the number behind it is the

success rate

<b>1</b>	100	<b>21</b>	100	<b>41</b>	100	<b>61</b>	100	<b>81</b>	100
<b>2</b>	0	<b>22</b>	100	<b>42</b>	100	<b>62</b>	100	<b>82</b>	100
<b>3</b>	0	<b>23</b>	100	<b>43</b>	100	<b>63</b>	100	<b>83</b>	100
<b>4</b>	100	<b>24</b>	100	<b>44</b>	100	<b>64</b>	100	<b>84</b>	100
<b>5</b>	100	<b>25</b>	100	<b>45</b>	100	<b>65</b>	100	<b>85</b>	100
<b>6</b>	100	<b>26</b>	100	<b>46</b>	100	<b>66</b>	100	<b>86</b>	100
<b>7</b>	100	<b>27</b>	100	<b>47</b>	100	<b>67</b>	100	<b>87</b>	100
<b>8</b>	100	<b>28</b>	100	<b>48</b>	100	<b>68</b>	100	<b>88</b>	100
<b>9</b>	100	<b>29</b>	100	<b>49</b>	100	<b>69</b>	100	<b>89</b>	100
<b>10</b>	100	<b>30</b>	100	<b>50</b>	100	<b>70</b>	100	<b>90</b>	100
<b>11</b>	100	<b>31</b>	100	<b>51</b>	100	<b>71</b>	100	<b>91</b>	100
<b>12</b>	100	<b>32</b>	100	<b>52</b>	100	<b>72</b>	100	<b>92</b>	100
<b>13</b>	100	<b>33</b>	100	<b>53</b>	100	<b>73</b>	100	<b>93</b>	100
<b>14</b>	100	<b>34</b>	100	<b>54</b>	100	<b>74</b>	100	<b>94</b>	100
<b>15</b>	100	<b>35</b>	100	<b>55</b>	100	<b>75</b>	100	<b>95</b>	100
<b>16</b>	100	<b>36</b>	100	<b>56</b>	100	<b>76</b>	100	<b>96</b>	100
<b>17</b>	100	<b>37</b>	100	<b>57</b>	100	<b>77</b>	100	<b>97</b>	100
<b>18</b>	100	<b>38</b>	100	<b>58</b>	100	<b>78</b>	100	<b>98</b>	100
<b>19</b>	100	<b>39</b>	100	<b>59</b>	100	<b>79</b>	100	<b>99</b>	100
<b>20</b>	100	<b>40</b>	100	<b>60</b>	100	<b>80</b>	100		

As we can see, our program always finds a solution. Except for two cases: 2 queens and 3 queens. The reason for this is that there are no configurations for those cases that satisfy the problem.

We ran each amount of queens 5 times by adding the following code:

```

1      case 2:
2          for (int j = 0; j < 100; j++)
3          {
4              nqueens = j;
5              succes = 0;
6              for (int i = 0; i < 5; i++)
7              {
8                  hillClimbing();
9                  if(countConflicts() == 0)
10                 {
11                     succes++;
12                 }
13             }
14             printf("with %d queens, succes: %d\n", nqueens,
15                    succes);
16         }
17         break;

```

The result was a smoking computer and the number five being printed after every amount of queens.

## Simulated annealing

### Problem analysis

We used the pseudo code in the book. Based on this we wrote our own program.

### Program design

We have a separate function that maps the time to temperature. In our main function we count the amount of conflicts of the current configuration and the amount of conflicts of the next configuration.

The difference here is that in the book, the pseudo code assumes that a higher value is better, however in our case, lower values are better. This is also the reason why our start temperatures are between 0 and 1.

Either that, or we would have to choose start temperatures such as 500 and instead of using  $e^{\Delta E / \text{temperature}}$  we would have to use  $e^{\Delta E * \text{temperature}}$ .

Also, instead of using  $\Delta E = \text{next.VALUE} - \text{current.VALUE}$  we use  $\Delta E = \text{currentConflicts} - \text{nextConflicts}$

### Program extension

Later on we added the function that half of the time it would pick the best option instead of a random one. More about this is in the answer of question 4. For this we used the function *climb* from hill climbing.

## Program evaluation

For each of these we used 5000 iterations and start temperature 0.5:

**n = 12**

output: correct solution  
real 0m3.290s  
user 0m0.002s  
sys 0m0.000s

**n= 25**

output: correct solution  
real 0m3.044s  
user 0m0.059s  
sys 0m0.000s

**n = 99**

output: correct solution  
real 0m18.305s  
user 0m16.057s  
sys 0m0.104s

**valgrind for n = 25:**

```
==2675==  
==2675== HEAP SUMMARY:  
==2675== in use at exit: 0 bytes in 0 blocks  
==2675== total heap usage: 28 allocs, 28 frees, 4,748 bytes allocated  
==2675== ==2675== All heap blocks were freed – no leaks are possible  
==2675== ==2675== For counts of detected and suppressed errors, rerun  
with: -v  
==2675== ERROR SUMMARY: 0 errors from 0 contexts (suppressed: 0 from  
0)
```

## Questions

1. see report
2. With a linear function the program had trouble solving the problem. After some research we discovered that the following function was quite popular:

$$\frac{startTemp}{\ln(time)}$$

And indeed, our program found a solution more often with this function.

3. to test this we ran the same code snippet as we used for hill climbing except each amount of queens is tested 10 times instead of 5. Also we do not count the cases 2 and 3 as no solution found. With a start temperature of 0.01 it does not find a solution 100% after 20 queens. The first time it found no solutions at all was after 51 queens. With a start temperature of 0.5 it does not find a solution 100% of the time after 13 queens. The first time it found no solutions at all was after 37 queens. With a start temperature of 0.99 it does not find a solution 100% of the time after 6 queens. The first time it found no solutions at all was after 37 queens.

However for each of these temperatures, there are cases where it still finds all or most of the solutions. Based on this, we can conclude that temperatures closer to 0 are more likely to work for higher values of  $n$ , while start temperatures closer to 1 fail earlier. Note that this test used only 5000 iterations. If we use more iterations, the program is way more likely to find a solution.

4. The reason the algorithm doesn't work for  $n$  is higher than 10 is that at random the successor state is chosen (and then checked if it is better). The higher our  $n$ , the higher the chance that it will mostly choose successors that are (in the end) worse. We can make this better by instead of choosing its successor completely random, choosing 50% of the time the best case and otherwise a random one. This will always find the right solution. (Note!: if you make the amount of iterations very high (for example 50000) it will find for any  $n \leq 99$  a solution most of the time.

## Genetic algorithm

### Problem analysis

We can use divide and conquer to tackle this problem. There are several functions that need to be implemented for a genetic algorithm. These functions are: a fitness function, a parent selection function, a reproduce function and a mutate function. We focused on these functions one by one.

### Program design

The genetic algorithm needs a few functions. First it needs a fitness function that determines how good the current configuration is. We based this function on the amount of non attacking pairs. Then we need a random selection function. This function randomly selects two parents from the population and then selects the best of these two based on their fitness. Then we need a function that makes a child. This function has two parents and a random integer as

input. Then the first part of parent 1 up until the random integer is copied to the child, the rest is from parent 2.

## Program evaluation

For each of these outputs we used the following:

population size:  $10 * \text{amount of queens}$   
max iterations: 5000  
mutate chance: 35%

### 8 queens

real 0m4.027s  
user 0m0.035s  
sys 0m0.000s

### 25 queens

real 0m6.459s  
user 0m1.340s  
sys 0m0.000s

### 99 queens

real 0m6.459s  
user 0m1.340s  
sys 0m0.000s

### valgrind for n = 12

```
==2764==  
==2764== HEAP SUMMARY:  
==2764== in use at exit: 0 bytes in 0 blocks  
==2764== total heap usage: 34,678 allocs, 34,678 frees, 1,666,496 bytes allocated  
==2764==  
==2764== All heap blocks were freed – no leaks are possible  
==2764==  
==2764== For counts of detected and suppressed errors, rerun with: -v  
==2764== ERROR SUMMARY: 0 errors from 0 contexts (suppressed: 0 from 0)
```

Even though this algorithm basically always finds a solution, it takes a very very long time when the number of queens is very high.

We see that the genetic algorithm is the slowest. Hill climbing and simulated annealing are quite similar, but simulated annealing is generally a bit faster. Simulated annealing also finds a solution more often.

## Exercise 2: Game of Nim

### Problem description

Nim is a simple two-player game. There exist many variations of the game. In this lab, we consider the following variation. We start with a pile of  $n$  matches, where  $n \geq 3$ . Two players, Max and Min, take turns to remove  $k$  matches from the pile, where  $k = 1$ ,  $k = 2$ , or  $k = 3$ . The player who takes the last match loses. Max makes the first move.

### Problem analysis

To decide on the optimal move, we look for which move maximizes the worst-case scenario. This way, if the other agent plays suboptimal, our strategy will always result in our expected outcome, or a better one. We can use the MiniMax algorithm, as described in the book on page 116, to calculate the outcome of the game if both agents play optimally.

### Program design

We only need one function `negaMax` which first checks whether it is a terminal. If this is the case it will return the value that is on the leaf. After that, it will go through all possible options of the amount of matches it can take of the table. And recursively calls the function again with the new values. After that it knows the best move and returns that.

### Program extension

We add a transposition table to our program. For this we create an array of length 200. We initialize this array with 0s. This way we can easily check if the state has already been visited. If it has not been visited we put the move in this array. By doing this we prevent our program from checking states that have already been visited.

### Program evaluation

We ran the program for the following inputs:

**matches = 5:**

5: Max takes 1  
4: Min takes 3



1: Max loses

**matches = 22:**

22: Max takes 1  
21: Min takes 1  
20: Max takes 3  
17: Min takes 1  
16: Max takes 3  
13: Min takes 1  
12: Max takes 3  
9: Min takes 1  
8: Max takes 3  
5: Min takes 1  
4: Max takes 3  
1: Min loses

**Valgrind for n = 74:**

```
==2050==  
==2050== HEAP SUMMARY:  
==2050== in use at exit: 0 bytes in 0 blocks  
==2050== total heap usage: 1 allocs, 1 frees, 1,024 bytes allocated  
==2050==  
==2050== All heap blocks were freed – no leaks are possible  
==2050==  
==2050== For counts of detected and suppressed errors, rerun with: -v  
==2050== ERROR SUMMARY: 0 errors from 0 contexts (suppressed: 0 from  
0)
```

## Programming questions

1. Use the utility +1 for a win by Max, and  $-1$  for a win by Min (there cannot be a draw in Nim!). Consider the games with  $n = 3$ ,  $n = 4$ ,  $n = 5$ , and  $n = 6$  matches. Who will (assuming optimal play) win which game? Explain why.

$n = 3$ , Max begins; he removes two matches from the pile ( $k = 2$ ), now  $n = 1$ . The only legal move for Min is to remove one match from the pile ( $k = 1$ ). This results in a win for Max.

$n = 4$ , Max begins; he removes three matches from the pile ( $k = 3$ ), now  $n = 1$ . The only legal move for Min is to remove one match from the pile ( $k = 1$ ). This results in a win for Max.

$n = 5$ , Max begins; he cannot remove four matches from the pile, this is not a legal move. So there is no way for him to win the game next turn. If he removes one, two or three matches from the pile, the game will continue at  $n = 4$ ,  $n = 3$  or  $n = 2$ . The first two situations result in a win for the player next to make a move (as demonstrated above). For  $n = 2$ , Min is next. Min removes one match from the pile, and gives the turn to Max at  $n = 1$ . The only legal move is to remove one match from the pile, resulting in a win for Min.

$n = 6$ , Max begins; he removes one match from the pile and gives the turn to Min with  $n = 5$ . As seen above, for  $n = 5$ , every move results in a loss. Max wins.

2. see code/programming report
3. With the current program, the higher the amount of matches, the longer we have to wait, because we need to check a lot of states.  
The transposition table helped a lot as it is now able to solve all games (up until 100), because we do not check the duplicate states.

## Program files for exercise 1

### nqueens.c

```
1  /* nqueens.c: (c) Arnold Meijster (a.meijster@rug.nl) */
2
3  #include <stdio.h>
4  #include <stdlib.h>
5  #include <math.h>
6  #include <time.h>
7
8  #define MAXQ 100
9  #define MAXITERATIONS 5000
10 #define POPULATIONSIZE 1000
11 #define MUTATECHANCE 35
12
13 #define FALSE 0
14 #define TRUE 1
15 #define MAXSW 100
16
17 #define ABS(a) ((a) < 0 ? -(a) : (a))
18
19 int nqueens;      /* number of queens: global variable */
20 int queens[MAXQ]; /* queen at (r,c) is represented by queens[r] == c */
21
22 void initializeRandomGenerator() {
23     /* this routine initializes the random generator. You are not
24      * supposed to understand this code. You can simply use it.
25      */
26     time_t t;
27     srand((unsigned) time(&t));
28 }
29
30 /* Generate an initial position.
31  * If flag == 0, then for each row, a queen is placed in the first
32  * column.
33  * If flag == 1, then for each row, a queen is placed in a random column.
34  */
35 void initiateQueens(int flag) {
36     int q;
37     for (q = 0; q < nqueens; q++) {
38         queens[q] = (flag == 0 ? 0 : random() % nqueens);
39     }
40 }
41
42 /* returns TRUE if position (row0,column0) is in
43  * conflict with (row1,column1), otherwise FALSE.
44  */
45 int inConflict(int row0, int column0, int row1, int column1) {
46     if (row0 == row1) return TRUE; /* on same row, */
47 }
```

```

46     if (column0 == column1) return TRUE; /* column, */
47     if (ABS(row0-row1) == ABS(column0-column1)) return TRUE; /* diagonal */
48     return FALSE; /* no conflict */
49 }
50
51 /* returns TRUE if position (row,col) is in
52  * conflict with any other queen on the board, otherwise FALSE.
53  */
54 int inConflictWithAnotherQueen(int row, int col) {
55     int queen;
56     for (queen=0; queen < nqueens; queen++) {
57         if (inConflict(row, col, queen, queens[queen])) {
58             if ((row != queen) || (col != queens[queen])) return TRUE;
59         }
60     }
61     return FALSE;
62 }
63
64 /* print configuration on screen */
65 void printState() {
66     int row, column;
67     printf("\n");
68     for(row = 0; row < nqueens; row++) {
69         for(column = 0; column < nqueens; column++) {
70             if (queens[row] != column) {
71                 printf(".");
72             } else {
73                 if (inConflictWithAnotherQueen(row, column)) {
74                     printf("Q");
75                 } else {
76                     printf("q");
77                 }
78             }
79         }
80         printf("\n");
81     }
82 }
83
84 /* move queen on row q to specified column, i.e. to (q,column) */
85 void moveQueen(int queen, int column) {
86     if ((queen < 0) || (queen >= nqueens)) {
87         fprintf(stderr, "Error in moveQueen: queen=%d "
88             "(should be 0<=queen<%d)...Abort.\n", queen, nqueens);
89         exit(-1);
90     }
91     if ((column < 0) || (column >= nqueens)) {
92         fprintf(stderr, "Error in moveQueen: column=%d "
93             "(should be 0<=column<%d)...Abort.\n", column, nqueens);
94         exit(-1);
95     }

```

```

96     queens[queen] = column;
97 }
98
99 /* returns TRUE if queen can be moved to position
100 * (queen,column). Note that this routine checks only that
101 * the values of queen and column are valid! It does not test
102 * conflicts!
103 */
104 int canMoveTo(int queen, int column) {
105     if ((queen < 0) || (queen >= nqueens)) {
106         fprintf(stderr, "Error in canMoveTo: queen=%d "
107             "(should be 0<=queen<%d)...Abort.\n", queen, nqueens);
108         exit(-1);
109     }
110     if (column < 0 || column >= nqueens) return FALSE;
111     if (queens[queen] == column) return FALSE; /* queen already there */
112     return TRUE;
113 }
114
115 /* returns the column number of the specified queen */
116 int columnOfQueen(int queen) {
117     if ((queen < 0) || (queen >= nqueens)) {
118         fprintf(stderr, "Error in columnOfQueen: queen=%d "
119             "(should be 0<=queen<%d)...Abort.\n", queen, nqueens);
120         exit(-1);
121     }
122     return queens[queen];
123 }
124
125 /* returns the number of pairs of queens that are in conflict */
126 int countConflicts() {
127     int cnt = 0;
128     int queen, other;
129     for (queen=0; queen < nqueens; queen++) {
130         for (other=queen+1; other < nqueens; other++) {
131             if (inConflict(queen, queens[queen], other, queens[other])) {
132                 cnt++;
133             }
134         }
135     }
136     return cnt;
137 }
138
139 /* evaluation function. The maximal number of queens in conflict
140 * can be 1 + 2 + 3 + 4 + .. + (nqueens-1)=(nqueens-1)*nqueens/2.
141 * Since we want to do ascending local searches, the evaluation
142 * function returns (nqueens-1)*nqueens/2 - countConflicts().
143 */
144 int evaluateState() {
145     return (nqueens-1)*nqueens/2 - countConflicts();

```

```

146 }
147
148 /*****
149
150  /* A very silly random search 'algorithm' */
151  #define MAXITER 1000
152  void randomSearch() {
153      int queen, iter = 0;
154      int optimum = (nqueens-1)*nqueens/2;
155
156      while (evaluateState() != optimum) {
157          printf("iteration %d: evaluation=%d\n", iter++, evaluateState());
158          if (iter == MAXITER) break; /* give up */
159          /* generate a (new) random state: for each queen do ...*/
160          for (queen=0; queen < nqueens; queen++) {
161              int pos, newpos;
162              /* position (=column) of queen */
163              pos = columnOfQueen(queen);
164              /* change in random new location */
165              newpos = pos;
166              while (newpos == pos) {
167                  newpos = random() % nqueens;
168              }
169              moveQueen(queen, newpos);
170          }
171      }
172      if (iter < MAXITER) {
173          printf ("Solved puzzle. ");
174      }
175      printf ("Final state is");
176      printState();
177  }
178
179  /*****
180
181  void climb(int * minConflicts, int * startConflicts, int ** costMatrix)
182  {
183      *minConflicts = countConflicts();
184      *startConflicts = *minConflicts;
185      int counter = 0;
186
187      //for loop that puts the conflict values in the matrix
188      for (int i = 0; i < nqueens; i++)
189      {
190          int currentPos = columnOfQueen(i);
191          for (int j = 0; j < nqueens; j++)
192          {
193              //put a -1 at the position where we find a queen
194              if(currentPos == j)
195                  {

```

```

196         costMatrix[i][j] = -1;
197     }
198     else
199     {
200         queens[i] = j;
201         costMatrix[i][j] = countConflicts();
202
203         //we found a new lowest value
204         if(costMatrix[i][j] < *minConflicts)
205         {
206             *minConflicts = costMatrix[i][j];
207             counter = 1;
208         }
209         else if(costMatrix[i][j] == *minConflicts)
210         {
211             counter++;
212         }
213     }
214 }
215 //reset queens
216 queens[i] = currentPos;
217
218 }
219
220 //select a random queen from the minimum values and move that
221 //queen
222 counter = random() % (counter + 1);
223
224 for (int i = 0; i < nqueens; i++)
225 {
226     for (int j = 0; j < nqueens; j++)
227     {
228         if(costMatrix[i][j] == *minConflicts)
229         {
230             if(counter == 0)
231             {
232                 queens[i] = j;
233             }
234             counter--;
235         }
236
237         if(counter == -1)
238         {
239             break;
240         }
241     }
242 }
243
244 //function that implements hill climbing

```

```

245 void hillClimbing() {
246     int** costMatrix = malloc(nqueens*sizeof(int*));
247     for (int i = 0; i < nqueens; i++)
248     {
249         costMatrix[i] = malloc(nqueens*sizeof(int));
250     }
251
252     int minConflicts;
253     int startConflicts;
254     int sideways = MAXSW;
255
256     do
257     {
258         climb(&minConflicts, &startConflicts, costMatrix);
259
260         sideways = (minConflicts == startConflicts)? sideways - 1:
                     MAXSW;
261     } while(minConflicts < startConflicts || sideways > 0);
262
263     //print solution and free everything
264     printState();
265     for (int i = 0; i < nqueens; i++)
266     {
267         free(costMatrix[i]);
268     }
269     free(costMatrix);
270 }
271
272 /*****
273 //function that maps the time to temperature
274 float timeToTemperature(int t) {
275     float startTemp = 0.5;
276     return startTemp / (float)log(t+1);
277 }
278
279 void simulatedAnnealing() {
280     float temperature;
281     int next;
282     int deltaE;
283     int newConflicts;
284     int startConflicts;
285     int currentPos;
286
287     //initiliaze cost matrix
288     int** costMatrix = malloc(nqueens*sizeof(int*));
289     for (int i = 0; i < nqueens; i++)
290     {
291         costMatrix[i] = malloc(nqueens*sizeof(int));
292     }
293

```



```

294     int minConflicts;
295
296     for (int i = 0; i <= MAXITERATIONS; i++)
297     {
298         //have a 50% chance it will actually choose the best
                option
299         if(0.5 < (double)rand() / (double)RAND_MAX)
300         {
301             climb(&minConflicts, &startConflicts, costMatrix);
302         }
303         else
304         {
305             //current conflicts
306             startConflicts = countConflicts();
307
308
309             temperature = timeToTemperature(i);
310
311             //solution found
312             if(temperature == 0 || startConflicts == 0)
313             {
314                 printState();
315                 for (int i = 0; i < nqueens; i++)
316                 {
317                     free(costMatrix[i]);
318                 }
319                 free(costMatrix);
320                 return;
321             }
322
323             do
324             {
325                 next = random() % (nqueens * nqueens);
326             }while(!canMoveTo(next / nqueens, next % nqueens));
327
328             //next state conflicts
329             currentPos = columnOfQueen(next / nqueens);
330             queens[next/nqueens] = next % nqueens;
331             newConflicts = countConflicts();
332
333             deltaE = startConflicts - newConflicts;
334             //reset queen
335             queens[next/nqueens] = currentPos;
336
337
338             //determine if we go to the next state
339             if(newConflicts <= startConflicts)
340             {
341                 queens[next/nqueens] = next % nqueens;
342             }

```

```

343         else if (exp(deltaE/temperature) > (double)rand()
344             / (double)RAND_MAX)
345         {
346             queens[next/nqueens] = next % nqueens;
347         }
348     }
349     printState();
350     for (int i = 0; i < nqueens; i++)
351     {
352         free(costMatrix[i]);
353     }
354     free(costMatrix);
355 }
356
357
358 /*****
359 //fitness function based on the amount of non attacking pairs
360 int fitness(int * currentQueens)
361 {
362     for (int i = 0; i < nqueens; i++)
363     {
364         queens[i] = currentQueens[i];
365     }
366     return nqueens * (nqueens - 1) / 2 - countConflicts();
367 }
368
369 //create a child based of two parents
370 int * reproduce(int * x, int * y, int n)
371 {
372     int *child = malloc(nqueens * sizeof(int));
373
374     for (int i = 0; i < n; i++)
375     {
376         child[i] = x[i];
377     }
378
379     for (int i = n; i < nqueens; i++)
380     {
381         child[i] = y[i];
382     }
383
384     return child;
385 }
386
387 //select two parents and select the best out of the two based on fitness
388 int * randomSelection(int * currentPopulation[POPULATIONSIZE], int
    totalCurrentPQ)
389 {
390     int rand1 = random() % (nqueens*10);

```

```

391     int rand2;
392     do
393     {
394         rand2 = random() % (nqueens*10);
395     }while(rand1 == rand2);
396
397     if(fitness(currentPopulation[rand1]) >
398        fitness(currentPopulation[rand2]))
399     {
400         return currentPopulation[rand1];
401     }
402     return currentPopulation[rand2];
403 }
404 //do a random mutation to the child
405 int * mutate(int * child)
406 {
407     if(random() % 100 <= MUTATECHANCE)
408     {
409         int rand = random() % nqueens;
410         child[rand] = random() % nqueens;
411     }
412     return child;
413 }
414
415 void genetic()
416 {
417     int * newPopulation[POPULATIONSIZE];
418     int * currentPopulation[POPULATIONSIZE];
419     int totalNewPQ = 0;
420     int totalCurrentPQ = 0;
421
422     //initialize some random population
423     for (int i = 0; i < nqueens*10; i++)
424     {
425         currentPopulation[i] = malloc(nqueens * sizeof(int));
426         for (int j = 0; j < nqueens; j++)
427         {
428             currentPopulation[i][j] = random()%nqueens;
429         }
430         totalNewPQ += fitness(currentPopulation[i]);
431     }
432
433
434     for (int i = 0; i < MAXITERATIONS; i++)
435     {
436         totalCurrentPQ = totalNewPQ;
437         totalNewPQ = 0;
438
439         //go through the population

```

```

440     for (int j = 0; j < nqueens*10/2; j++)
441     {
442         //set from two parents two new childs
443         int * x;
444         int * y;
445         int * child1;
446         int * child2;
447         int n = random()%(nqueens - 2) + 1;
448         x = randomSelection(currentPopulation,
449                             totalCurrentPQ);
450         do
451         {
452             y = randomSelection(currentPopulation,
453                                 totalCurrentPQ);
454             }while(x == y);
455
456         //reproduce
457         child1 = reproduce(x, y, n);
458         child2 = reproduce(y, x, n);
459
460         //mutate
461         mutate(child1);
462         mutate(child2);
463
464         if(i != 0)
465         {
466             free(newPopulation[2*j]);
467             free(newPopulation[2*j+1]);
468
469         }
470
471         //set it in the new population and return it if
472         //they are the final solution
473         newPopulation[2*j] = child1;
474         newPopulation[2*j+1] = child2;
475
476         if(fitness(child1) == nqueens * (nqueens - 1)/ 2)
477         {
478             for (int k = 0; k < nqueens; k++)
479             {
480                 queens[k] = child1[k];
481             }
482             printState();
483             for (int i = 0; i < nqueens*10; i++)
484             {
485                 free(currentPopulation[i]);
486                 free(newPopulation[i]);
487             }
488             return;
489         }
490     }

```

```

487         if(fitness(child2) == nqueens * (nqueens - 1)/ 2)
488         {
489             for (int k = 0; k < nqueens; k++)
490             {
491                 queens[k] = child2[k];
492             }
493             printState();
494             for (int i = 0; i < nqueens*10; i++)
495             {
496                 free(currentPopulation[i]);
497                 free(newPopulation[i]);
498             }
499             return;
500         }
501         totalNewPQ += fitness(child1) + fitness(child2);
502
503
504
505     }
506     //set currentPopulation to the new population
507     for (int j = 0; j < nqueens*10; j++)
508     {
509         for (int k = 0; k < nqueens; k++)
510         {
511             currentPopulation[j][k] =
                    newPopulation[j][k];
512         }
513
514     }
515 }
516 //find the best one of the population
517 int maxPQ = fitness(currentPopulation[0]);
518 int index = 0;
519 for (int i = 1; i < nqueens*10; i++)
520 {
521     int pq = fitness(currentPopulation[i]);
522
523     if(pq > maxPQ)
524     {
525         maxPQ = pq;
526         index = i;
527     }
528 }
529
530 //copy the best solution
531 for (int i = 0; i < nqueens; i++)
532 {
533     queens[i] = currentPopulation[index][i];
534 }
535

```

```

536         //print solution and free everything
537         printState();
538         for (int i = 0; i < nqueens*10; i++)
539         {
540             free(currentPopulation[i]);
541             free(newPopulation[i]);
542         }
543     }
544
545     int main(int argc, char *argv[])
546     {
547         srand ((unsigned int)time(NULL));
548         int algorithm;
549
550         do {
551             printf ("Number of queens (1<=nqueens<=%d): ", MAXQ);
552             scanf ("%d", &nqueens);
553         } while ((nqueens < 1) || (nqueens > MAXQ));
554
555         do {
556             printf ("Algorithm: (1) Random search (2) Hill climbing ");
557             printf("(3) Simulated Annealing (4) Genetic: ");
558             scanf ("%d", &algorithm);
559         } while ((algorithm < 1) || (algorithm > 4));
560
561         initializeRandomGenerator();
562
563         initiateQueens(1);
564
565         printf("\nInitial state:");
566         printState();
567
568         switch (algorithm)
569         {
570             case 1: randomSearch();    break;
571             case 2: hillClimbing();    break;
572             case 3: simulatedAnnealing(); break;
573             case 4: genetic();         break;
574         }
575
576         return 0;
577     }

```

## Program files for exercise 2

### nim.c

```
1  #include <stdio.h>
2  #include <stdlib.h>
3
4  #define MAX 0
5  #define MIN 1
6
7  #define INFINITY 9999999
8
9  int negaMax(int state, int color, int * bestMove, int
    transpositionTable[200])
10 {
11     //is terminal
12     if (state == 1)
13     {
14         //psuedocode states return -color, but that doesn't work,
15         //if we return -1 it works exactly the same (up untill
16         //20) as the algorithm in the given code
17         return -1;
18     }
19
20     //return from the transpositionTable if it excist
21     if(transpositionTable[100 + color*state] != 0)
22     {
23         int winOrLoose = - 1 *
24             negaMax(state-transpositionTable[100 + color*state],
25                 -1 * color, bestMove, transpositionTable);
26         *bestMove = transpositionTable[100 + color*state];
27         return winOrLoose;
28     }
29
30     int v = -INFINITY;
31     int currentBestMove = 1;
32     for (int move = 1; move <= 3; move++)
33     {
34         if (state - move > 0)
35         {
36             int m = - 1 * negaMax(state-move, -1 * color,
37                 bestMove, transpositionTable);
38             if(m > v)
39             {
40                 currentBestMove = move;
41                 v = m;
42             }
43         }
44     }
45 }
```

```

42     transpositionTable[100 + color*state] = currentBestMove;
43     *bestMove = currentBestMove;
44     return v;
45 }
46
47 void playNim(int state)
48 {
49     int turn = 0;
50     int transpositionTable[200] = { 0 };
51
52     while (state != 1)
53     {
54         int action = 1;
55         negaMax(state, (turn==MAX) ? 1 : -1, &action,
                    transpositionTable);
56
57         //reset transposition table
58         for (int i = 0; i < 200; i++)
59         {
60             transpositionTable[i] = 0;
61         }
62
63         printf("%d: %s takes %d\n", state,
                (turn==MAX ? "Max" : "Min"), action);
64
65         state = state - action;
66         turn = 1 - turn;
67     }
68     printf("1: %s loses\n", (turn==MAX ? "Max" : "Min"));
69 }
70
71
72 int main(int argc, char *argv[]) {
73     if ((argc != 2) || (atoi(argv[1]) < 3)) {
74         fprintf(stderr, "Usage: %s <number of sticks>, where ", argv[0]);
75         fprintf(stderr, "<number of sticks> must be at least 3!\n");
76         return -1;
77     }
78
79     playNim(atoi(argv[1]));
80
81     return 0;
82 }

```