

Some comments on the efforts taken to improve the Isolation game AI

#### Improving heuristic function

I spend quite a lot of time trying to find a way to improve the heuristic functions used for evaluating the position value. To do it I ran millions of test where the different version of heuristic functions played against each other. However I had a hard time finding any practical functions that would improve the performance of simple mobility measures (number of own moves available or improved\_score).

The first approach that I tried was incrementally varying coefficient  $c$  in the expression  $N\_own\_moves - c * N\_opponent\_moves$ , from .1 to 2, but it did not seem to improve the test results in any significant way.

The second approach I tried was to refine the estimates of number of moves available after a few moves from a given position, however these evaluation functions were more difficult to evaluate and had very modest effect on accuracy of the position value estimates, and in the end the additional computational effort required for more advanced functions did not warrant its use. It seemed that it was much better to keep the evaluation function very simple, but evaluate more positions at deeper levels.

#### Converted mobility values

The last approach that I tried was to convert the raw mobility scores used in improved\_heuristic to some modified version of the score:

##### a) linear\_mobility\_conversion

converts simple mobility score in the following manner

$f(1) = 1$ ,  $f(2) = 1 + 1/2$ ,  $f(7) = 1 + 1/2 + \dots + 1/7$ , where argument of  $f$  is number of moves available

now the improved heuristics is  $f(own\_moves) - f(opp\_moves)$

##### b) quadratic\_mobility\_conversion

converts simple mobility score in the following manner

$f(1) = 1$ ,  $f(2) = 1 + 1/4$ ,  $f(3) = 1 + 1/4 + 1/9$ , etc

##### c) mixed\_mobility\_conversion

$f\_mixed(own\_moves, opp\_moves) =$

$= (f\_linear(own\_moves) - f\_linear(opp\_moves)) * ((f\_quadratic(own\_moves) - f\_quadratic(opp\_moves)))$

To speed up the calculations a table giving results of all possible scores is calculated beforehand. The new linear, quadratic, and mixed\_mobility conversion scores give a modest improvement of 5-10% over the original improved\_score evaluation function. The idea is that these new functions distinguish between the situations of 8 moves against 7 and 2 moves against 1 giving bigger advantage to the situation of 2 moves against one. In general one can't say that this strategy always works, yet it seems to give some slight advantage on average, without much additional computational effort.

Since I was not able to improve the evaluation functions significantly I spend additional effort on improving alpha-beta search efficiency and improving pruning. I tried the following move ordering techniques:

##### a) ordering all the moves based on the results of the evaluation of previous level during iteration deepening

##### b) only making sure that the best move from the previous evaluation is considered first

In addition to move ordering I also saved the result of the previous searches in a map structure this allowed me to reuse some of the results of the previous searches during Iteration Deepening Search.

The move ordering together with saving previous results, allowed to gain some appreciable advantage over the non-optimized alpha-beta search. Approach a) was 55-70% faster on average, while approach b) 65-80% faster.

I feel that a major reason for the slower performance of the full ordering is due to pruning in alpha-beta search which does not guarantee that the ordering of the nonoptimal nodes is correct. Also the estimates of moves utility varied quite a bit when going from shallower to deeper search, all the way to depth of 10, meaning that the move ordering was far from perfect

Additionally I also modified isolation.py file

1) I inserted the checks for symmetry that are described on the next page.

2) I wrote additional functions so that the game positions can be reverted back and forth instead of generating a completely new position during the AlphaBeta algorithm evaluation. This allowed a further speed up of around 20%

## Symmetry

Determining whether there is a symmetry in the position is extremely important, because it is easy to show that

if one of the players was able to take the position symmetrical to its opponent, the game can be won following

a very simple strategy. For example on any board of size  $n \times m$  where both  $n$  and  $m$  are even player 2 will always

win by responding with a move that reflects the position of player 1. Say the board size is 4 by 4. Then in

response to any move by player 1, player 2 can take the position that reflects player 1 move with respect to the

center. In response to move b2 by player 1 player 2 goes to c3. In this position player 1 has 4 moves:

a4, c4, d3, d1.

Player 2 job is to maintain the symmetry. Response to a4 : d1, to c4 : b1, to d3: a2, to d1 : a4. Each response

maintains the symmetry around the center. It is guaranteed that player 1 would run out of moves first.

The center symmetry strategy works for player 2 on any boards if both dimensions are even, or one dimension is

even and another is odd. Furthermore it works as a special case for the board of sizes  $3 \times 3$ ,  $n \times 1$  and  $1 \times n$ .

If the size of the board is  $n \times m$  where both  $n$  and  $m$  are odd, there exist one square in the center of the board that

the player 2 can't reflect. However if the center square was previously occupied and the position is symmetrical

then player 1 can use the strategy to win the game.

There are 3 more symmetry strategies that exist:

- 1) symmetry about horizontal center line
- 2) symmetry about vertical center line
- 3) If the board is of size  $n \times n$  symmetry around diagonals

symmetry about horizontal center line:

It works similar to symmetry around center. When the width of the board is even then the center line divides

the board along the line that goes between the two center fields. Given the same example of 4 by 4 board and

player 1 moving to b2 the new correspondence square for player 2 is c2 instead of c3, the response to a4: d4, to c4: b:4, to d3:a3, to d1:a1, and again player2 wins in the

end by maintaining

symmetry each turn.

When the board width is an odd number the center line goes through the center column.

To create conditions for

maintaining symmetry all the squares on the center line must be unavailable. Player 1 wins if he can achieve

symmetry after all the squares on the center line are filled or unreachable

Symmetry about vertical line:

See notes about symmetry about horizontal line

Symmetry about the diagonal.

The symmetry about the diagonal works in manner similar to symmetry around center lines, but occurs only

when the board is square. The symmetry can only be achieved if all the squares on the diagonal in question are

unreachable. If the board height is odd the symmetry benefits player1, if the height is even player 2 benefit

#### *Symmetry in 7x7 board*

*While the symmetries around the center and vertical lines as well as major diagonals were discussed above, the positions necessary for these symmetries to occur are not achievable in practice for 7x7 board.*

*The only symmetry of practical significance is the one around the center.*

*But even the symmetry around the center is quite rare. While running 10000 tournament tests with alpha-beta players going to the depth of 7 with one evaluating center symmetry and another one not the symmetry was only encountered 547 times in total. Given that there are  $\sim 6^7 \cdot 15$  positions evaluated each game the effect of symmetry evaluation was rather small. Out of the 20000 total games played the player with the symmetry evaluation won 10003.*

*Several special starting positions for 7x7 board (not included in the program)*

*1) d4*

*... b3 (or b5, c2, c6, e2, e6, f3, f5)*

*2) f5 or (f3, e6, e2, c6, c2, b5, b3)*

*and player 1 takes symmetrical position and wins*

*1) c2 (or any of the other squares reachable from d4)*

*... d4*

*2) any move from c2*

*... e6*

*and even though the player 2 is not in a truly symmetrical position, but rather lags by 1 move from true symmetry. The player 2 will be able to win by going to the square that is symmetrical to the one player 1 held on previous turn. It is easy to show that player 1 would not be able to block player 2 moves and is guaranteed to run out of moves first. Player 2 wins*

*1) a1 (or any of the corners)*

*... d4*

*2) b3 (c2 is not better)*

*... f5 (e6 for c2)*

*Now the position is not fully symmetrical as one of the corners is empty, while another one is filled, but player 1 will lose if he ever attempts stepping into asymmetric corner, so player 2 proceeds to a win by taking symmetrical position with respect to player 1. Player 2 wins*

*I am attaching the results of tournament evaluations as a separate spreadsheet.*