## Udacity - AIND (Build a Gameplay Agent) Project Analysis

I implemented total 3 heuristic evaluation functions. For the evaluation function 3, I counted the players' legal moves and opponents' legal moves. The return value is the difference between the numbers of players' legal moves and the numbers of opponents' legal moves. When it comes to evaluation function 2, the basic concept is similar to the first one (players' legal moves – opponents' legal moves). However, I used the different weight based on the available (remained) moves on the game. In other words, if the available moves are smaller than about half of the total number of moves on the game, I thought that it will be more reasonable to limit the opponent moves in order to increase the winning rate within the limited available spaces. Therefore, in that case, I used the strategy, which is players' legal moves – 2\*opponents' legal moves. Lastly, for my evaluation function 1, I made use of the heuristic function integrating legal moves and center score for both player and opponent. The more players' legal moves and opponents' distance to center is, the more winning rate is. Therefore, the final return value will be as follow: players' legal moves – opponents' legal moves + opponents' distance to center – players' distance to center. Below picture is the final tournament result for all 3 heuristic evaluation functions. (10 games (Top), 40 games (Bottom))

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Match #  1 2 3 4 5 6 7	Opponent  Random  MM_Open  MM_Center  MM_Improved  AB_Open  AB_Center  AB_Improved	AB_Improved Won   Lost 8	AB_Custom Won   Lost 8   2 9   1 8   2 8   2 4   6 9   1 5   5	AB_Custom_2 Won   Lost 10   0 7   3 9   1 6   4 5   5 5   5	AB_Custom_3 Won   Lost 9   1 9   1 8   2 8   2 5   5 5   5
Win Rate: 68.6% 72.9% 67.1% 70.0%  **************************  Playing Matches  ***********************************					
Match #  1 2 3 4 5 6 7	Opponent Random MM_Open MM_Center MM_Improved AB_Open AB_Center AB_Improved	AB_Improved Won   Lost 38   2 29   11 34   6 27   13 21   19 25   15 17   23	AB_Custom Won   Lost 36   4 25   15 37   3 30   10 19   21 24   16 20   20	AB_Custom_2 Won   Lost 38   2 30   10 34   6 26   14 21   19 21   19 20   20	AB_Custom_3 Won   Lost 38   2 29   11 35   5 30   10 26   14 23   17 20   20
	Win Rate:	68.2%	68.2%	67.9%	71.8%

As you can see, the average performance (winning rate) of 1<sup>st</sup> evaluation function is 70.5% and 3<sup>rd</sup> evaluation function is 70.8%, both better than that of 'AB\_Improved'. The take way in this result is that 3<sup>rd</sup> evaluation function is the best one even though I initially expected that 1<sup>st</sup> heuristic function would be the best one since the 1<sup>st</sup> heuristic logic covers both the center distances and legal moves. The reason of relatively low performance of 1<sup>st</sup> heuristic evaluation is that the simple linear combination of center distance and legal moves evaluation function didn't give the synergy. In this case, 3<sup>rd</sup> evaluation is the best heuristic evaluation. First of all, the test result proved the best performance. The overall winning rate is 70.8%, and it is obvious to pick it up as the best one. Secondly, 3<sup>rd</sup> heuristic evaluation is overall robust/strong to all of 7 opponents. For example, 1<sup>st</sup> evaluation is too weak toward specific opponent, such as the one using 'Open' score algorithm (MM\_Open, AB\_Open). Therefore, 1<sup>st</sup> heuristic cannot be the best one even though the average performance is almost close to 3<sup>rd</sup> one. Finally, the 3<sup>rd</sup> heuristic function is the simplest, and might have lowest computational complexity. The function

just calculates the difference between players' legal moves and opponents' legal moves. However, 1<sup>st</sup> evaluation function calculates the additional information, distance to center for both parties. 2<sup>nd</sup> evaluation function also requires additional information such as currently available moves, and has conditional statement.

However, in this project, my conclusion is that "The optimal heuristic function is difficult to implement". In order to organize optimal heuristic, we might analyze our algorithm in more detail, and it could be the future homework for Udacity student.