David Hariton Katz

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## **Heuristic Analysis: Game-Playing Isolation Agent**

Isolation is a deterministic, adversarial game between two players with perfect information. For this project, we created an intelligent agent to navigate the game using different search heuristics. In the analysis below, we compare four different search heuristics against a baseline agent ("AB\_Improved") in tournament match play.

## **Results:**

Match #	Opponent	AB_Improved Won   Lost	Opp_Diff Won   Lost		OD_Aggressive Won   Lost	OD_Decay Won   Lost
1	Random	45   5	47   3	48   2	48   2	47   3
2	MM_Open	38   12	36   14	37   13	33   17	39   11
3	MM_Center	41   9	42   8	43   7	42   8	46   4
4	MM_Improved	35   15	36   14	39   11	37   13	34   16
5	AB_0pen	24   26	27   23	23   27	25   25	25   25
6	AB_Center	30   20	26   24	34   16	25   25	25   25
7	AB_Improved	25   25	24   26	31   19	29   21	27   23
	Win Rate:	68.0%	68.0%	72.9%	68.3%	69.4%

## **Analysis:**

- ➤ <u>Heuristic 1</u>: Oppositional Difference Between Available Moves ('Opp Diff')
  - o **Summary:** Returns the difference (float) between the number of legal moves available to the player and the number of legal moves available to the opponent
  - Performance: This simple heuristic performed with similar success to the
     AB Improved baseline. It is crisp and useful but could be improved upon.
- ➤ <u>Heuristic 2</u>: Oppositional Difference Defensive Orientation ('OD\_Defensive')
  - Summary: Similar mathematical structure to Opp\_Diff, except the number of legal moves available to the player is weighted by a factor of 'theta' = 2 \*
  - Performance: Surprisingly, the defensive-oriented heuristic performed the best in tournament play, achieving a 72.9% win rate. By prioritizing the player's own moves, the agent was able to elude defeat more consistently and reign victorious.
- ➤ <u>Heuristic 3</u>: Oppositional Difference Aggressive Orientation ('OD\_Aggressive')
  - o **Summary:** Similar mathematical structure to  $Opp\_Diff$ , except the number of legal moves available to the **opponent** is weighted by a factor of 'theta' = 2 \*
  - o **Performance:** Achieving a win rate of 68.3%, the aggressively oriented agent outperformed the baseline by only 0.3%. Consistently attempting to minimize an

<sup>\*</sup> Chosen empirically

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opponent's moves over the course of a game does appear create any substantive advantage in victory, which makes sense. At the beginning of a game, it is very difficult to limit an opponents moves, and this heuristic may have sacrificed earlygame positional advantage to ineffectively limit an opponent's moves

- ➤ Heuristic 4: Oppositional Difference Increasing Aggression ('OD Decay')
  - o **Summary:** Similar mathematical structure to aggressive and defensive variations of *Opp\_Diff*, except we incorporate a 'game\_ratio' variable that reflects how much of the game has been completed. In the beginning of the game, our player puts more value on its own mobility; however, as the game progresses, the player puts more value on limiting its opponent's moves.
  - Performance: This was the second-highest performing heuristic (win rate: 69.4%). The incorporation of the game\_ratio was intended to bring together the best of the aggressive and defensive oriented heuristics, but it did execute to expectations. Intuitively, I believe that this heuristic should be the most effective, but more experimentation is needed to find an effective rate of defensive decay and initial weight, theta.

## **Recommendation:**

- ➤ Best Heuristic: *Oppositional Difference Defensive-Orientation (OD Defensive)* 
  - o Achieved the highest win percentage in match-play (72.9%)
  - Low complexity and computational cost
  - Logically makes sense Preserve your own moves
  - o Simple heuristics are generally more effective (i.e. Ockham's Razor)