### The George Kingsley Zipf AI Engine: Decision Making

Created by Erin Dahlgren December 1 2011 Modified by Erin Dahlgren January 2 2012

# Zipf's goal $\min(\frac{losses_{games}}{\forall endgames})$

Zipf is interested in the statistic above, which essentially maximizes his own wins and ties by minimizing the rest of the endgame space that does not include wins and ties: losses. This boils down to minimizing losses/(wins + ties + losses). To compute this, Zipf recurses through the game tree until he finds an endgame, tallies its status (win, tie, or loss), and moves back up and down the tree until he has traversed it completely. He computes the statistic for all moves he's considering and chooses the move with the lowest value.

Crucially Zipf does not need to do this at every move: for any move he is considering, it is a parent to only *part* of the entire game tree. But more important, there are situations, like at the end of the game, when recursing is just plain unnecessary. This is because there is often only one move that will prevent his death or ensure his win. Zipf only makes statistically minded decisions when he is not in an immediate win situation or a 'do-or-die' situation and has multiple places on the board to choose from.

Zipf first uses a filter. This is optimals in the Engine module.

If there is only one move returned from the filter, Zipf takes it immediately. See choose in the Engine module.

If there is more than one move returned, Zipf starts to reason statistically. See recurse\_tree, get\_stats, and compute\_stats in the Engine module.

Cases of statistical reasoning (recursing the game tree) occur at the beginning of the game, because there is little chance for immediately losing or winning. You will see in the engine that I have fixed the computer (not in the testgames.py module but in the user-interactive main.py and its dependents) because the computer is then at the disadvantage. I wanted to ensure that even in this role, George Kingsley Zipf could never lose.

## 1. Statistical Reasoning: First moves

	choice	wins	losses	ties	l/w+l+t
	(0,1)	756	2048	864	0.5583
77	(0,2)	1132	1832	576	0.5175
X	(1,0)	756	2048	864	0.5583
	(1,0) $(1,1)$	1312	1436	720	0.4140
		936	1902	288	0.6084
	(1,2)				
	(2,0)	1132	1832	576	0.5175
	(2,1)	936	1902	288	0.6084
	(2,2)	936	1652	1008	0.4593
					1/
<u>.</u>	choice	wins	losses	ties	l/w+l+t
	(0,0)	1276	1798	864	0.4565
<b>y</b>	(0,2)	1276	1798	864	0.4565
. A .	(1,0)	1080	1868	576	0.5300
. X . 	(1,1)	1652	1438	720	0.3774
.   .   .	(1,2)	1080	1868	576	0.5300
	(2,0)	1456	1652	288	0.4864
	(2,1)	900	2158	1008	0.5307
	(2,2)	1456	1652	288	0.4864
	(2,2)	1400	1002	200	0.4004
	choice	wins	losses	ties	l/w+l+t
					, . , . , .
	(0,0)	1132	1832	576	0.5175
	(0,0)	756	2048	864	0.5583
. X	(0,1) $(1,0)$	936	1902	288	0.6084
.   .   .		1312	1436	720	0.4140
	(1,1)				
1 1	(1,2)	756	2048	864	0.5583
	(2,0)	936	1652	1008	0.4593
	(2,1)	936	1902	288	0.6084
	(2,2)	1132	1832	576	0.5175
	choice	wins	losses	ties	l/w+l+t
	(0,0)	1276	1798	864	0.4565
1 1	(0,1)	1080	1868	576	0.5300
· · · · · · X · · · · · · · · · · · · ·	(0,2)	1456	1652	288	0.4864
A	(1,1)	1652	1438	720	0.3774
.   .   .	(1,2)	900	2158	1008	0.5307
	(2,0)	1276	1798	864	0.4565
	(2,1)	1080	1868	576	0.5300
	(2,2)	1456	1652	288	0.4864
	(				
	choice	wins	losses	ties	l/w+l+t
	(0,0)	792	1830	576	0.5722
1 1	(0,1)	612	2082	576	0.6366
· · ·	(0,2)	792	1830	576	0.5722
· · · · · · · · · · · · · · · · · · ·	(1,0)	612	2082	576	0.6366
.   .   .	(1,2)	612	2082	576	0.6366
	(2,0)	792	1830	576	0.5722
	(2,0) $(2,1)$	612	2082	576	0.6366
	(2,1) $(2,2)$	792	1830	576	0.5722
	(4,4)	102	1000	510	3.0122

	choice	wins	losses	ties	l/w+l+t
·   ·   ·   ·   ·   ·   ·   ·   ·   ·	(0,0) $(0,1)$	1456 1080	1652 1868	288 576	0.4864 0.5300
. X	(0,2)	1276	1798	864	0.4565
	(1,0)	900	2158	1008	0.5307
.   .   .	(1,1)	1652	1438	720	0.3774
	(2,0)	1456	1652	288	0.4864
	(2,1)	1080	1868	576	0.5300
	(2,2)	1276	1798	864	0.4565
	choice	wins	losses	ties	l/w+l+t
	(0,0)	1132	1832	576	0.5175
1	(0,1)	936	1902	288	0.6084
· · · · · · · · · · · · · · · · · · ·	(0,2)	936	1652	1008	0.4593
<u> </u>	(1,0)	756	2048	864	0.5583
X   .   .	(1,0) $(1,1)$	1312	1436	720	0.4140
	(1,2)	936	1902	288	0.6084
	(2,1)	756	2048	864	0.5583
	(2,1) $(2,2)$	1132	1832	576	0.5175
	(2,2)	1102	1002	010	0.0110
	choice	wins	losses	ties	l/w+l+t
	(0,0)	1456	1652	288	0.4864
<u>. . .</u>	(0,0) $(0,1)$	1456 900	1652 2158	288 1008	0.4864 0.5307
·   ·   ·   ·   ·   ·   ·   ·   ·   ·	(0,0) $(0,1)$ $(0,2)$	1456 900 1456	1652 2158 1652	288 1008 288	0.4864 0.5307 0.4864
	(0,0) $(0,1)$ $(0,2)$ $(1,0)$	1456 900 1456 1080	1652 2158 1652 1868	288 1008 288 576	0.4864 0.5307 0.4864 0.5300
	(0,0) (0,1) (0,2) (1,0) (1,1)	1456 900 1456 1080 1652	1652 2158 1652 1868 1438	288 1008 288 576 720	0.4864 0.5307 0.4864 0.5300 <b>0.3774</b>
	$(0,0) \\ (0,1) \\ (0,2) \\ (1,0) \\ (1,1) \\ (1,2)$	1456 900 1456 1080 1652 1080	1652 2158 1652 1868 1438 1868	288 1008 288 576 720 576	0.4864 0.5307 0.4864 0.5300 <b>0.3774</b> 0.5300
	$ \begin{array}{c} (0,0) \\ (0,1) \\ (0,2) \\ (1,0) \\ (1,1) \\ (1,2) \\ (2,0) \end{array} $	1456 900 1456 1080 1652 1080 1276	1652 2158 1652 1868 1438 1868 1798	288 1008 288 576 720 576 864	0.4864 0.5307 0.4864 0.5300 <b>0.3774</b> 0.5300 0.4565
	$(0,0) \\ (0,1) \\ (0,2) \\ (1,0) \\ (1,1) \\ (1,2)$	1456 900 1456 1080 1652 1080	1652 2158 1652 1868 1438 1868 1798	288 1008 288 576 720 576 864 864	0.4864 0.5307 0.4864 0.5300 <b>0.3774</b> 0.5300
	$ \begin{array}{c} (0,0) \\ (0,1) \\ (0,2) \\ (1,0) \\ (1,1) \\ (1,2) \\ (2,0) \end{array} $	1456 900 1456 1080 1652 1080 1276	1652 2158 1652 1868 1438 1868 1798	288 1008 288 576 720 576 864	0.4864 0.5307 0.4864 0.5300 <b>0.3774</b> 0.5300 0.4565
	(0,0) (0,1) (0,2) (1,0) (1,1) (1,2) (2,0) (2,2) choice	1456 900 1456 1080 1652 1080 1276 1276 wins	1652 2158 1652 1868 1438 1868 1798 1798	288 1008 288 576 720 576 864 864	0.4864 $0.5307$ $0.4864$ $0.5300$ $0.3774$ $0.5300$ $0.4565$ $0.4565$ $l/w+l+t$
	(0,0) (0,1) (0,2) (1,0) (1,1) (1,2) (2,0) (2,2) choice	1456 900 1456 1080 1652 1080 1276 1276 wins	1652 2158 1652 1868 1438 1868 1798 1798 losses	288 1008 288 576 720 576 864 864 <i>ties</i>	0.4864 $0.5307$ $0.4864$ $0.5300$ $0.3774$ $0.5300$ $0.4565$ $0.4565$ $l/w+l+t$ $0.4593$
	(0,0) (0,1) (0,2) (1,0) (1,1) (1,2) (2,0) (2,2) choice (0,0) (0,1)	1456 900 1456 1080 1652 1080 1276 1276 wins	1652 2158 1652 1868 1438 1868 1798 1798 losses	288 1008 288 576 720 576 864 864 <i>ties</i>	0.4864 $0.5307$ $0.4864$ $0.5300$ $0.3774$ $0.5300$ $0.4565$ $0.4565$ $l/w+l+t$ $0.4593$ $0.6084$
	(0,0) (0,1) (0,2) (1,0) (1,1) (1,2) (2,0) (2,2) choice (0,0) (0,1) (0,2)	1456 900 1456 1080 1652 1080 1276 1276 wins 936 936 1132	1652 2158 1652 1868 1438 1868 1798 1798 losses 1652 1902 1832	288 1008 288 576 720 576 864 864 <i>ties</i> 1008 288 576	0.4864 $0.5307$ $0.4864$ $0.5300$ $0.3774$ $0.5300$ $0.4565$ $0.4565$ $l/w+l+t$ $0.4593$ $0.6084$ $0.5175$
	(0,0) (0,1) (0,2) (1,0) (1,1) (1,2) (2,0) (2,2) choice (0,0) (0,1) (0,2) (1,0)	1456 900 1456 1080 1652 1080 1276 1276 wins 936 936 1132 936	1652 2158 1652 1868 1438 1868 1798 1798 losses 1652 1902 1832 1902	288 1008 288 576 720 576 864 864 <i>ties</i> 1008 288 576 288	0.4864 $0.5307$ $0.4864$ $0.5300$ $0.3774$ $0.5300$ $0.4565$ $0.4565$ $l/w+l+t$ $0.4593$ $0.6084$ $0.5175$ $0.6084$
	(0,0) (0,1) (0,2) (1,0) (1,1) (1,2) (2,0) (2,2) choice (0,0) (0,1) (0,2) (1,0) (1,1)	1456 900 1456 1080 1652 1080 1276 1276 wins 936 936 1132 936 1312	1652 2158 1652 1868 1438 1868 1798 1798 losses 1652 1902 1832 1902 1436	288 1008 288 576 720 576 864 864 <i>ties</i> 1008 288 576 288 720	0.4864 $0.5307$ $0.4864$ $0.5300$ $0.3774$ $0.5300$ $0.4565$ $0.4565$ $l/w+l+t$ $0.4593$ $0.6084$ $0.5175$ $0.6084$ $0.4140$
	$ \begin{array}{c} (0,0) \\ (0,1) \\ (0,2) \\ (1,0) \\ (1,1) \\ (1,2) \\ (2,0) \\ (2,2) \\ \hline \\ \textit{choice} \\ \hline \\ (0,0) \\ (0,1) \\ (0,2) \\ (1,0) \\ (1,1) \\ (1,2) \\ \end{array} $	1456 900 1456 1080 1652 1080 1276 1276 wins 936 936 1132 936 1312 756	1652 2158 1652 1868 1438 1868 1798 1798 losses 1652 1902 1832 1902 1436 2048	288 1008 288 576 720 576 864 864 <i>ties</i> 1008 288 576 288 720 864	0.4864 $0.5307$ $0.4864$ $0.5300$ $0.3774$ $0.5300$ $0.4565$ $0.4565$ $l/w+l+t$ $0.4593$ $0.6084$ $0.5175$ $0.6084$ $0.4140$ $0.5583$
	(0,0) (0,1) (0,2) (1,0) (1,1) (1,2) (2,0) (2,2) choice (0,0) (0,1) (0,2) (1,0) (1,1)	1456 900 1456 1080 1652 1080 1276 1276 wins 936 936 1132 936 1312	1652 2158 1652 1868 1438 1868 1798 1798 losses 1652 1902 1832 1902 1436	288 1008 288 576 720 576 864 864 <i>ties</i> 1008 288 576 288 720	0.4864 $0.5307$ $0.4864$ $0.5300$ $0.3774$ $0.5300$ $0.4565$ $0.4565$ $l/w+l+t$ $0.4593$ $0.6084$ $0.5175$ $0.6084$ $0.4140$

Observe that George Kingsley Zipf reasons that the center is his best move if it is available, and if not, a corner.

# 2. Crucial Second Moves: Potential forking

	X		
X	О		
(and	perm	uta	tions)

choice	wins	losses	ties	l/w+l+t
(0.0)	4.0	2.4	2.0	
(0,0)	40	24	36	0.24
(0,2)	48	34	12	0.3617
(1,2)	32	52	24	0.4814
(2,0)	48	34	12	0.3617
(2,1)	32	52	24	0.4814
(2,2)	56	32	0	0.3636

	choice	wins	losses	ties	l/w+l+t
$\begin{array}{c cccc} O & . & . & . \\ \hline . & X & . & . \\ \hline . & . & X \\ (and \ permutations) \end{array}$	$ \begin{array}{c} (0,1) \\ (0,2) \\ (1,0) \\ (1,2) \\ (2,0) \end{array} $	28 28 28 16 28	40 34 40 50 34	12 24 12 36 24	0.5 <b>0.3953</b> 0.5 0.4901 <b>0.3953</b>
	(2,1)	16	50	36	0.4901

## 3. The Granddaddy of boards: Double Potential Forking

If you inspect the statistics below, you will notice that Zipf's minimizing will not choose the correct output. This is not surprising: 'X' can fork the edges of the board using either the top-right corner or the bottom-left!

Meet the 'double fork'.

I found this situation extremely interesting, because it was the *only* edge case to my statistic. What ended up being the most elegant solution was performing a 45 degree transformation of the board and projecting the transformation downwards, such that 'X O X' rotated to (1,0), (1,1), (1,2). See rotate() in the Engine module for the specific map. This correctly positioned the statistics such that the minimum could be correctly selected for this board.

	choice	wins	losses	ties	l/w+l+t
X   .   .	(0,1)	40	34	12	0.3953
<del></del>	(0,2)	44	32	12	0.3636
. O .	(1,0)	40	34	12	0.3953
.   .   X	(1,2)	40	34	12	0.3953
(and permutations)	(2,0)	44	32	12	0.3636
	(2,1)	40	34	12	0.3953

transformation such that (0,1) or (2,1) are selected



What this means for the board

#### Improvements

#### 1. Speed

At the moment, George Kingsley Zipf takes one full second to make a decision about his first move. This is because he must search every node under each second possible move in the tree to accurately compute his statistic. I explored the possibility of alpha-beta pruning, and even wrote a version of recurse\_tree (not included in the code package) that would break out of the tree searching early upon meeting a condition. Unfortunately, I only have wins, ties, and losses attached to each node, and these grow at different rates (see Tests.pdf for a visual). I tried only using one: minimizing bare loss counts, but this was not robust enough to make the right decisions.

#### 2. Language block: more recursion

Recursion makes sense for traversing trees, especially when the depth of your tree searching is variable. I have tried to show my recursive strategies in all corners of the application, not just in the Engine module. I would like to extend my solution to a language where recursion is not only more natural, but often necessary, like in Haskell.