

<https://play.golang.org/p/3IFJkluUVc>

<https://play.golang.org/p/ls4evuDNNt>

## Analysis of 1-player Finite Probabilistic Games

$E[\text{pos}]$  = expected winnings having reached position pos

For final positions pos,  $E[\text{pos}]$

For non-final choice positions

$E[\text{pos}] =$

For non-final random event positions

$E[\text{pos}] =$

for every terminal position pos  
 $E[\text{pos}] \leftarrow \text{payoff}(\text{pos})$

for every nonterminal position pos  
if pos is a choice position  
 $\max \leftarrow -\infty$   
 $\text{argmax} \leftarrow \text{NIL}$   
for every choice c  
 $e \leftarrow E[\text{next}(\text{pos}, c)]$   
if  $e > \max$   
 $e \leftarrow \max$   
 $\text{argmax} \leftarrow c$   
 $E[\text{pos}] \leftarrow e$

else

$e \leftarrow 0.0$   
for every outcome  $\sigma$   
 $e \leftarrow e + P(\sigma) \cdot E[\text{next}(\text{pos}, \sigma)]$   
 $E[\text{pos}] \leftarrow e$

$E[\text{pos}] \leftarrow e$

Coins: Start with  $n$  coins.

On each turn, flip as many of your remaining coins as you wish.

If  $\#T \geq \#H$ , lose all the  $T$

Else earn  $\#H$  points

Win at  $X$  points

Lose if no coins left and  $< X$  points

## Yahtzee

Anchor:

component:

number of anchors:

modification:  $E[\text{pos}] =$

For nonterminal choice positions

$$E[\text{pos}] = \max_{\text{choice } c} E[\text{next}(\text{pos}, c)]$$

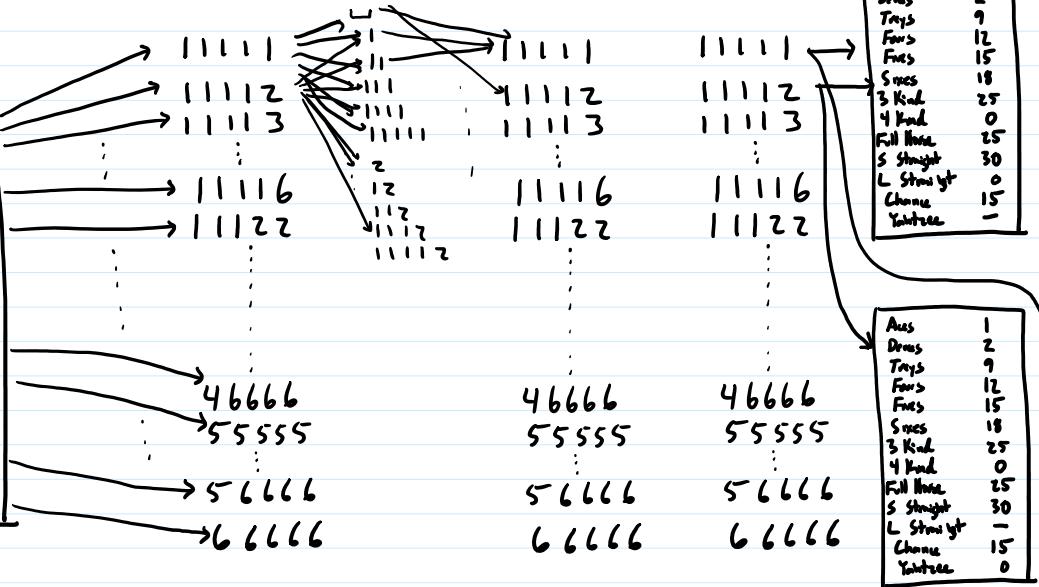
For nonterminal random event positions

$$E[\text{pos}] = \sum_{\text{outcome } \sigma} P(\sigma) \cdot E[\text{next}(\text{pos}, \sigma)]$$

#anchors =

### Yahtzee Graph

Aces	1
Duos	2
Treys	9
Fours	12
Fives	15
Sixes	18
3 Kind	25
4 Kind	0
Full House	25
5 Straight	30
L Straight	0
Chance	15
Yahtzee	-



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L Straight	10
Chance	15
Yahtzee	50

## Two-player Zero-sum, probabilistic finite games

For P1 choice position

$$E[pos] = \max \quad E[next(pos, c)]$$

For P2 choice position

$$E[pos] = \max \quad E[next(pos, c)]$$

For nonterminal random event positions

$$E[pos] = \sum_{\text{outcome } \sigma} P(\sigma) \cdot E[next(pos, \sigma)]$$

2-player Yahtzee anchors:

2-player Yahtzee variant:

1) get score distribution of optimal solitaire player

2) compute strategy that maximizes the probability of beating the optimal solitaire player

## Pig

2-players, turn-based

On each turn

roll

if 1, then turn over

else add number to turn total

decide: repeat

stop (and add turn total to score)

1st to 100 points wins

modify game:

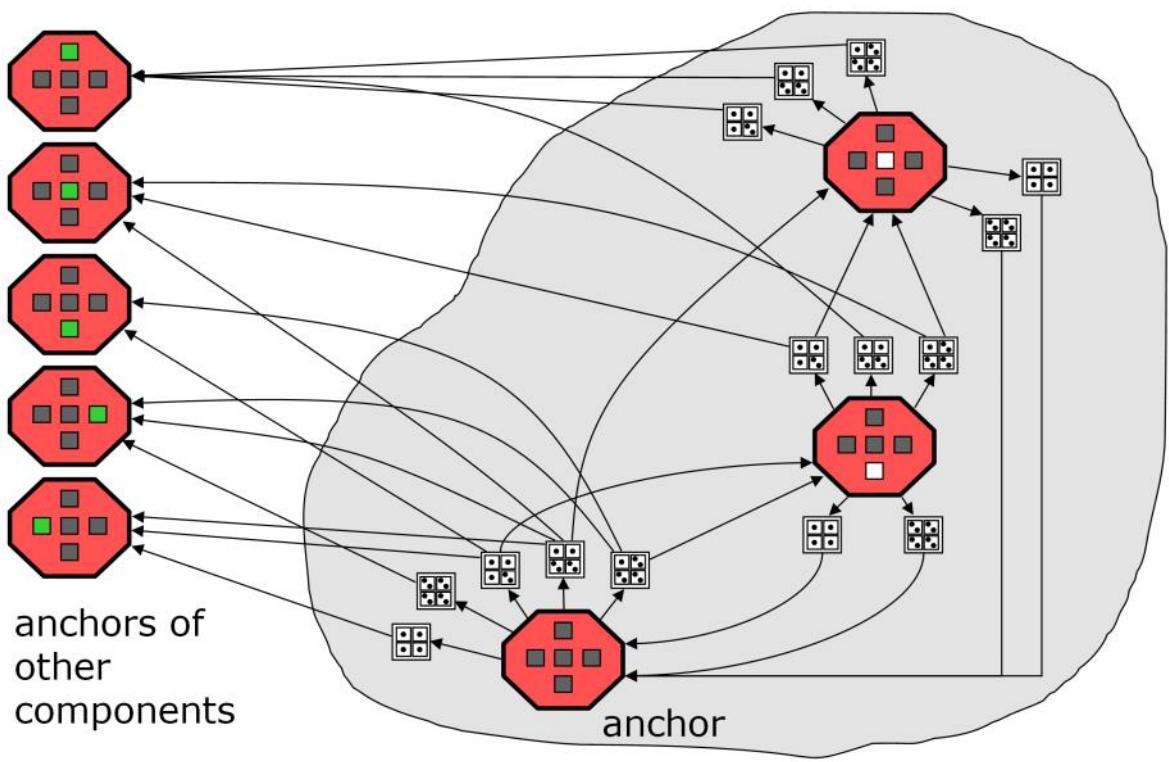
$$47 - 36 \xrightarrow{\text{roll 6}} 47 + 6 - 36 \xrightarrow[\text{roll again}]{\cdot} 47 - \frac{36}{\text{roll 1}}$$

cycle

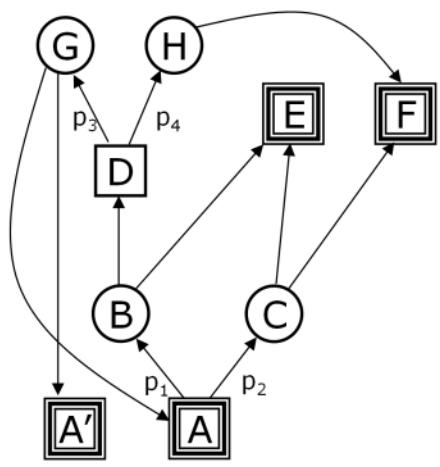
$E[x, y, n]$  = expected # wins for P1 given score is  $x$  to  $y$  w/n turns left

=

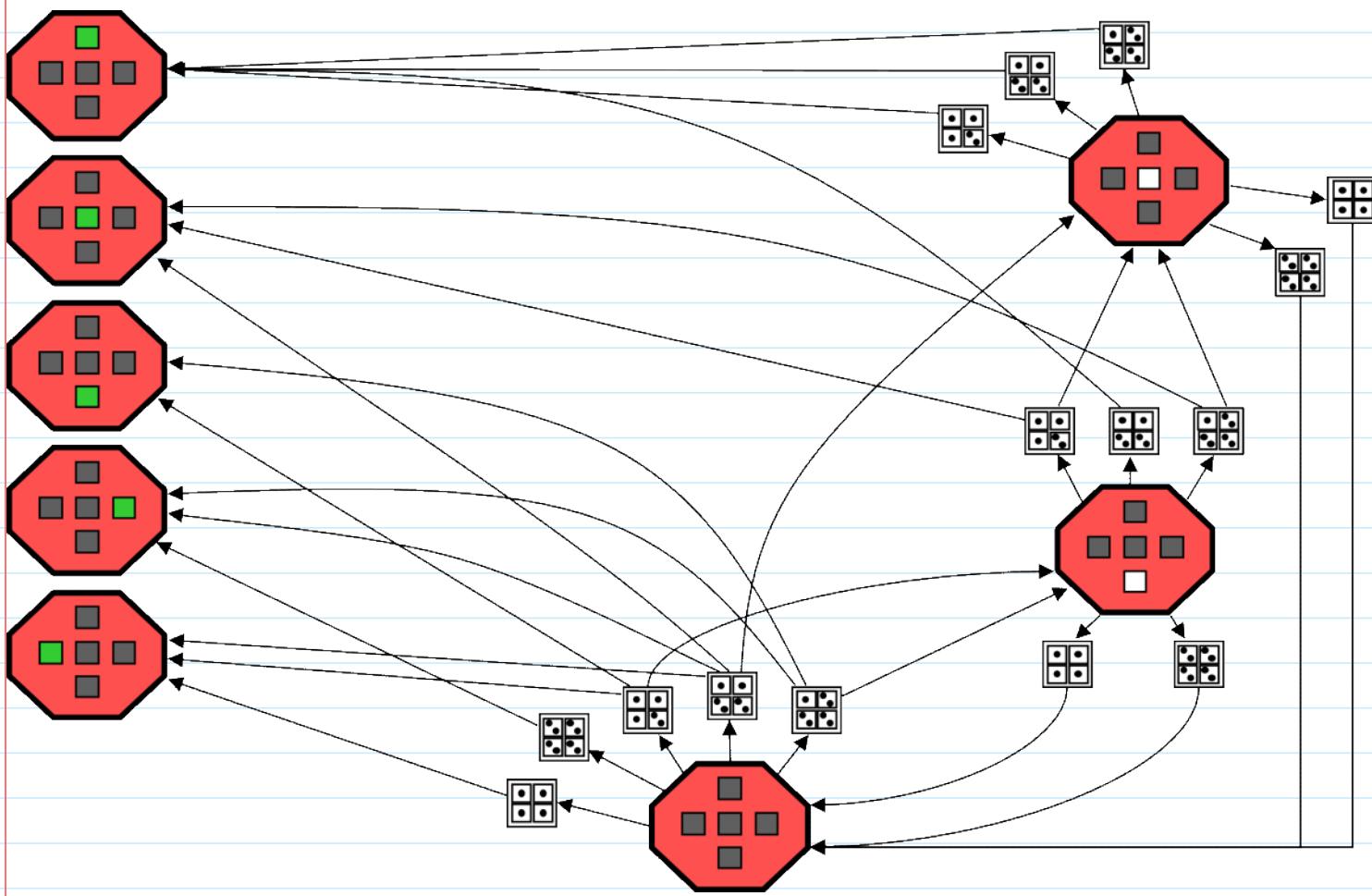
# Can't Stop Graph

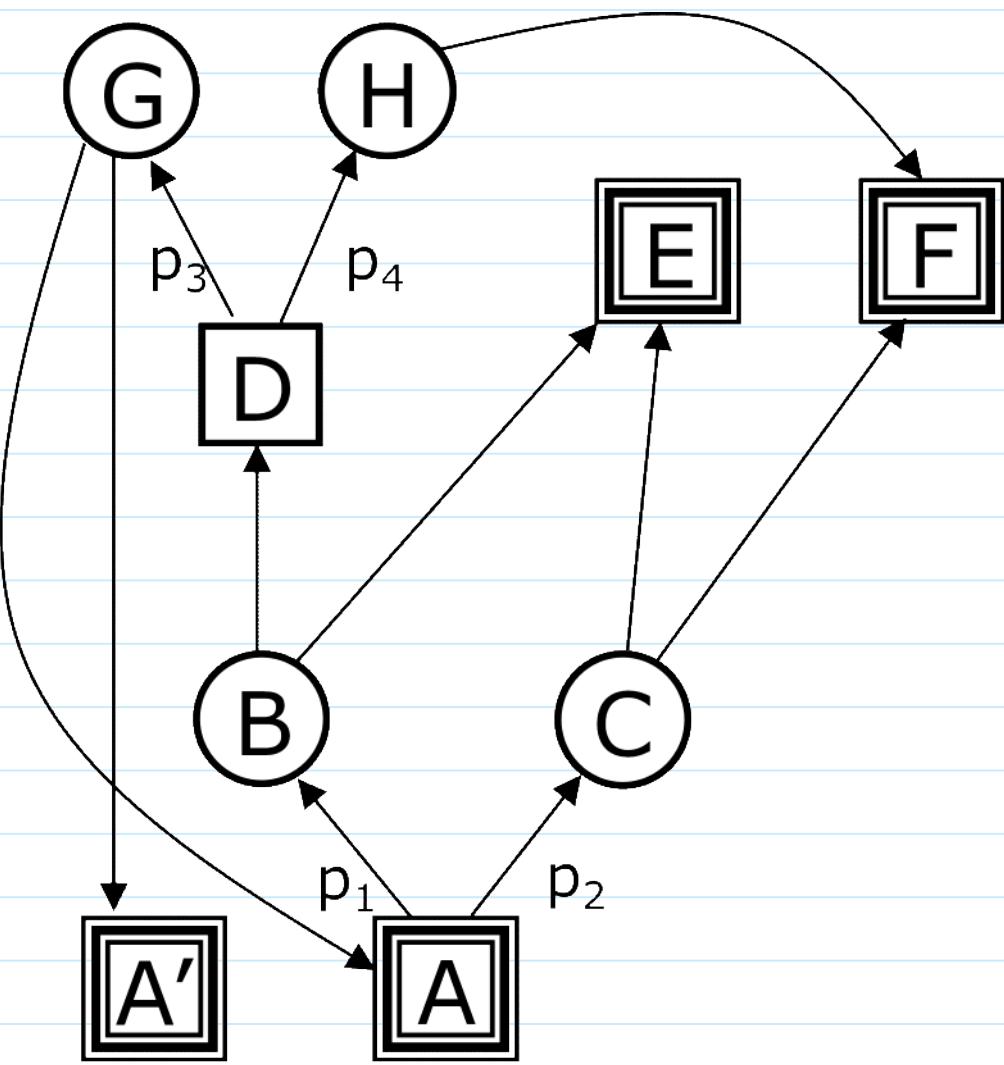


# Numerical Analysis

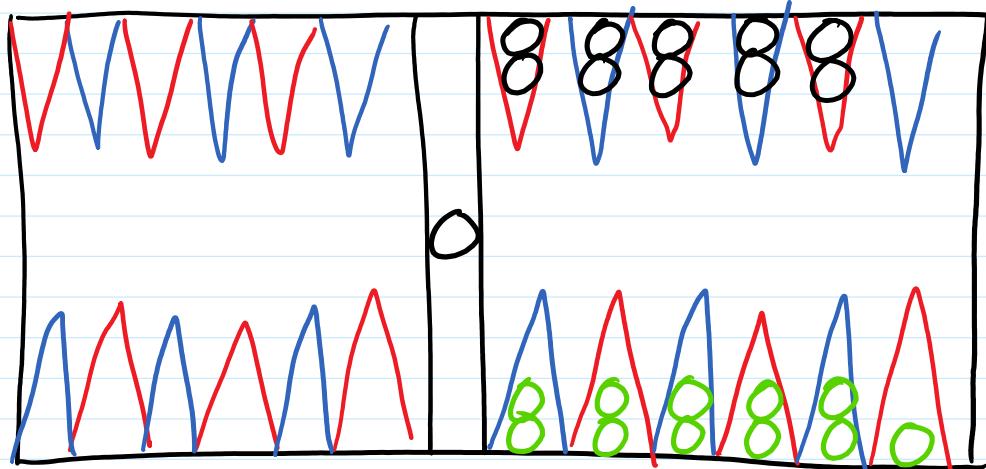


- Make a copy of anchor
- component is now a DAG
- Guess value of  $f(A')$
- $f(A)$  is a function of  $f(A')$
- Want fixed point
  
- Function is piecewise linear and continuous
- Fast convergence from Newton's method



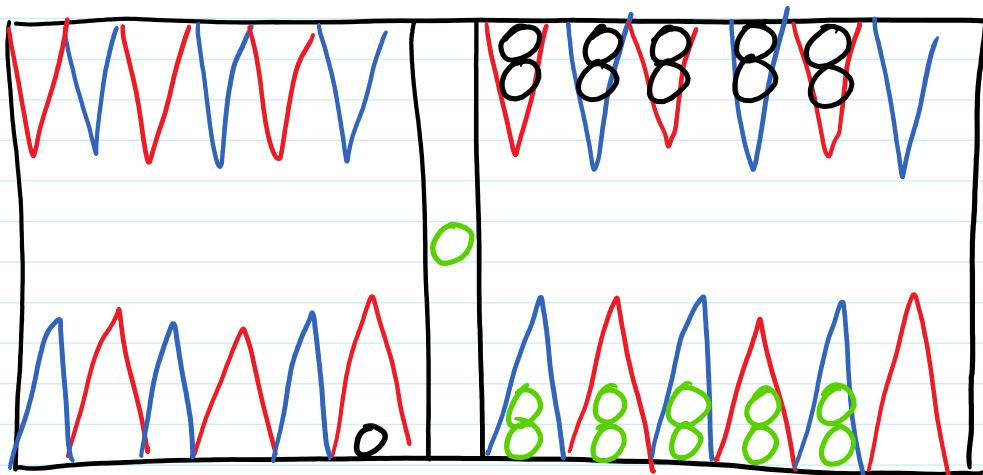


## Backgammon

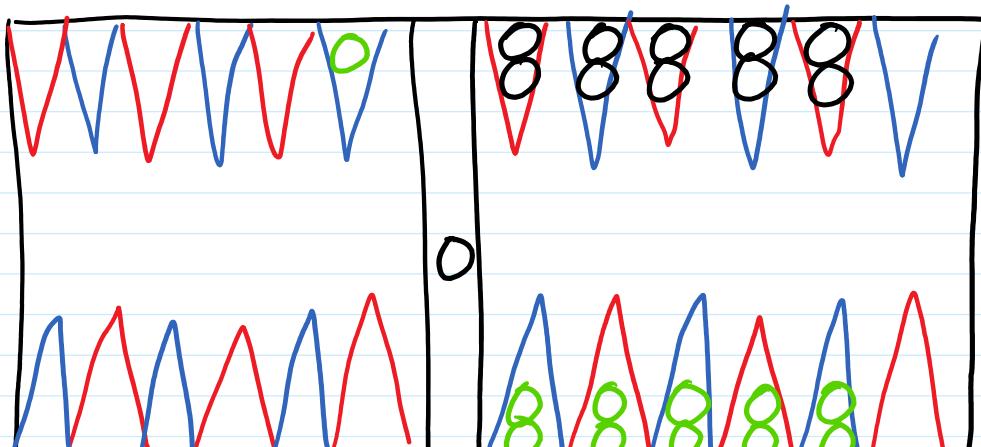


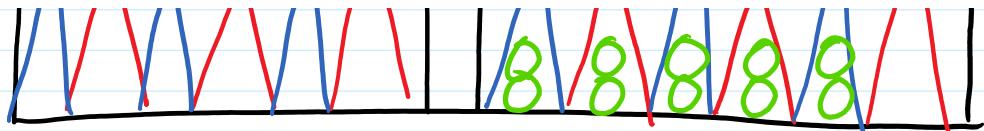
↙ O   ↘ O

Black rolls 1-6



Green rolls 5-1   4-1   3-6   1-6  
Black rolls 1-2   6-3   3-2





Black rolls  
Green rolls

6-5

2-3

4-3

1-3

5-5

1-2

2-4

3-2

1-6

### 3+ Player Pig

$E_1[x, y, z]$  = expected wins for next player when score is  $x-y-z$

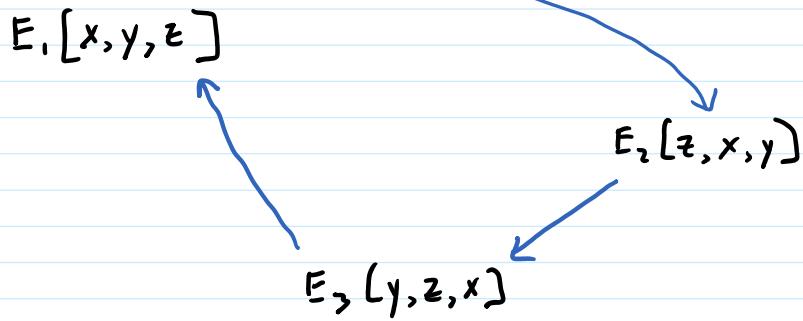
$E_{1xyz}[t]$  = expected wins for next when score is  $x-y-z$ ; subtotal  $t$

$$= \begin{cases} 1.0 & \text{if } x+t \geq T \\ \max(E_3[y, z, x+t], \frac{1}{6}(E_3[y, z, x] + \sum_{r=2}^6 E_{1xyz}(t+r))) \end{cases}$$

$E_2[x, y, z]$  = expected wins for next next player  
 $= \sum_{\text{outcomes}} P(\text{outcome}) \cdot E_1[\text{outcome}]$

$E_3[x, y, z]$  = expected wins for prev player  
 $= \sum_{\substack{\text{outcomes} \\ \text{with} \\ \text{next}}} P(\text{outcome}) \cdot E_2[\text{outcome}]$

one of these is  $y-z-x$



note  $E_1[x, y, z] + E_2[x, y, z] + E_3[x, y, z] = 1$

$$E_1[x, y, z] \quad E_1[y, z, x] \quad E_1[z, x, y]$$

$$E_2[x, y, z] \quad E_2[y, z, x] \quad E_2[z, x, y]$$