

# Group 1: Predicting the Outcomes of Tennis Tournaments

A Monte Carlo Approach

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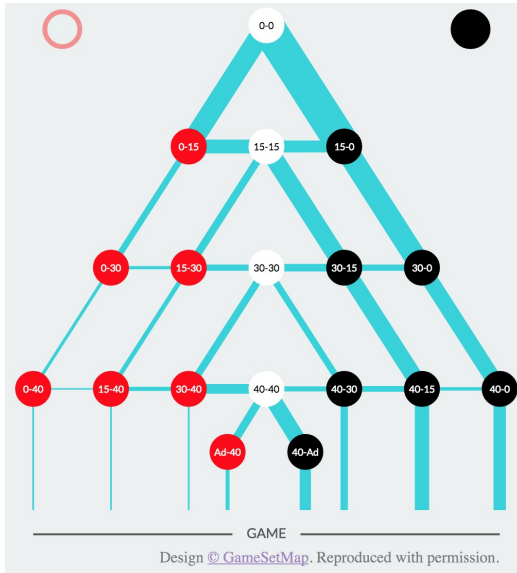
# Project

- ▶ Based on a paper by Paul K. Newton and Joseph B. Keller called *Probability of Winning at Tennis 1. Theory and Data*
- ▶ Paper discussed how the probability of winning a game, a set, and a match in tennis are computed based on each player's probability of winning a point on a serve
- ▶ Based on other papers the conclusion was made to treat serves in tennis as independent identically distributed (iid) random variables
- ▶ It is noted that points in tennis are not iid for most purposes. This is not a bad assumption as the divergence from iid is small
- ▶ Both two out of three and three out of five set matches were considered allowing for 13-point tiebreaker in each set if needed

# The Rules of Tennis

- ▶ Point: Smallest unit of measurement (Love-15-30-40-game)
- ▶ Game: A game is won when a player reaches 4 points with at least a 2 point advantage
- ▶ Set: A set is won by the player who wins 6 games first
- ▶ Advantage Set: If a game score of 6-6 is reached and advantage set rules are used, a player can only win a set with a 2 game lead
- ▶ Matches: Best of 3 sets (for women) or 5 sets (for men)
- ▶ Tie-break game: If a game score of 6-6 is reached and tie-break set rules are used. In a tie-break game, a player/team must reach 7 points with a two point advantage to win

# The Rules of Tennis



# Values

Things we need to know:

- ▶ Empirical probability of winning a rally on serve
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- ▶ Empirical probability of winning a game on serve

Things we need to calculate:

- ▶ Theoretical probability of winning a game on serve
- ▶ Theoretical probability of winning a set
- ▶ Theoretical probability of winning the tie-breaker
- ▶ Theoretical probability of winning a match

## Theoretical Probabilities: Rally and Game

$$P(\text{A Winning a Rally} \mid \text{A Served}) = p_A^R = \frac{\text{Points Won On Serve}}{\text{Points Served}}$$

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$$\begin{aligned} & P(\text{A Winning a Game} \mid \text{A Served}) \\ &= p_A^G = (p_A^R)^4 [1 + 4q_A^R + 10(q_A^R)^2] + 20(p_A^R q_A^R)^3 (p_A^R)^2 [1 - 2p_A^R q_A^R]^{-1} \end{aligned}$$

► Where Probability A loses a rally given A served:

$$q_A^R = 1 - \frac{\text{Points Won On Serve}}{\text{Points Served}}$$



## Theoretical Probabilities: Set

P(A Winnning a Set | A Served)

$$= p_A^S = \sum_{j=0}^4 p_A^S(6, j) + p_A^S(7, 5) + p_A^S(6, 6) p_A^T$$

## Theoretical Probabilities: Set

$$\begin{aligned} & P(\text{A Winning a Set} \mid \text{A Served}) \\ &= p_A^S = \sum_{j=0}^4 p_A^S(6, j) + p_A^S(7, 5) + p_A^S(6, 6) p_A^T \end{aligned}$$

Where,  $p_A^S(i, j)$  is defined recursively as:

$p_A^S(0, 0) = 1$ ,  $p_A^S(i, j) = 0$  if  $i < 0$  or  $j < 0$ .

- ▶ if  $i+j-1$  is even:  $p_A^S(i, j) = p_A^S(i-1, j)p_A^G + p_A^S(i, j-1)q_A^G$ 
  - ▶ omit  $i-1$  term if  $j=6$  and  $i < 6$
  - ▶ omit  $j-1$  term if  $i=6$  and  $j < 6$
- ▶ if  $i+j-1$  is odd:  $p_A^S(i, j) = p_A^S(i-1, j)q_B^G + p_A^S(i, j-1)p_B^G$ 
  - ▶ omit  $i-1$  term if  $j=6$  and  $i < 6$
  - ▶ omit  $j-1$  term if  $i=6$  and  $j < 6$

## Theoretical Probabilities: Tie Breaker

P(A Winning the Tie Breaker | A Served Initially)

$$= p_A^T = \sum_{j=0}^5 p_A^T(7, j) + p_A^T(6, 6) p_A^R q_B^R [1 - p_A^R p_B^R - q_A^R q_B^R]^{-1}$$

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- ▶ if  $i + j - 1 \bmod 4 \equiv 0$  or  $3$ :

$$p_A^S(i, j) = p_A^T(i - 1, j) p_A^R + p_A^T(i, j - 1) q_A^R$$

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$$p_A^T(i, j) = p_A^T(i - 1, j) q_B^R + p_A^T(i, j - 1) p_B^R$$

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## Theoretical Probabilities: Match

Women's (Best of 3):

P(A Winning the Match | A Served First)

$$= p_A^M = (p_A^S)^2 + 2(p_A^S)^2 p_B^S$$

# Theoretical Probabilities: Match

Women's (Best of 3):

P(A Winning the Match | A Served First)

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Men's (Best of 5):

P(A Winning the Match | A Served First)

$$= p_A^M = (p_A^S)^3 + 3(p_A^S)^3 p_B^S + 6(p_A^S)^3 (p_B^S)^2$$

Where:

- ▶  $p_A^S$  = Probability A wins a set given A served
- ▶  $p_B^S$  = Probability B wins a set given B served

# Data

Data used in paper:

- ▶ Men and Women semifinalists in the 2002 U.S Open tournament
- ▶ Men and Women semifinalists in the 2002 Wimbledon tournament

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Data used in our simulation:

- ▶ Men and Women semifinalists in the 2019 Wimbledon tournament



# Results of Game

Table 1: Data for the Womens Semifinalists in the 2002 U.S. Open Tournament

	P(Win a Rally)	Empirical P(Win a Game)	Paper P(Win a Game)	Our P(Win a Game)
S. Williams	0.69	0.71	0.89	0.89
V. Williams	0.63	0.80	0.79	0.79
L. Davenport	0.65	0.85	0.83	0.83
A. Mauresmo	0.63	0.77	0.79	0.79

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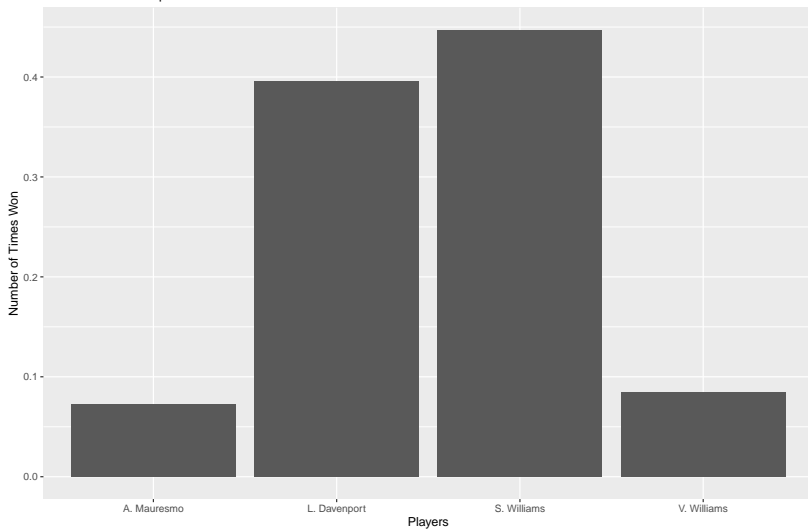
Table 2: Data for the Mens Semifinalists in the 2002 U.S. Open Tournament

	P(Win a Rally)	Empirical P(Win a Game)	Paper P(Win a Game)	Our P(Win a Game)
P. Sampras	0.73	0.95	0.93	0.93
A. Agassi	0.66	0.87	0.85	0.85
L. Hewitt	0.67	0.85	0.86	0.86
S. Schalken	0.68	0.90	0.88	0.88

# 2002 U.S Open: Women

Which Player Won the Tournament?

2002 Women's US Open



# 2002 U.S Open: Women

Semifinals

Final

1		<b>Serena Williams</b>	6	7	
4		<b>Lindsay Davenport</b>	3	5	

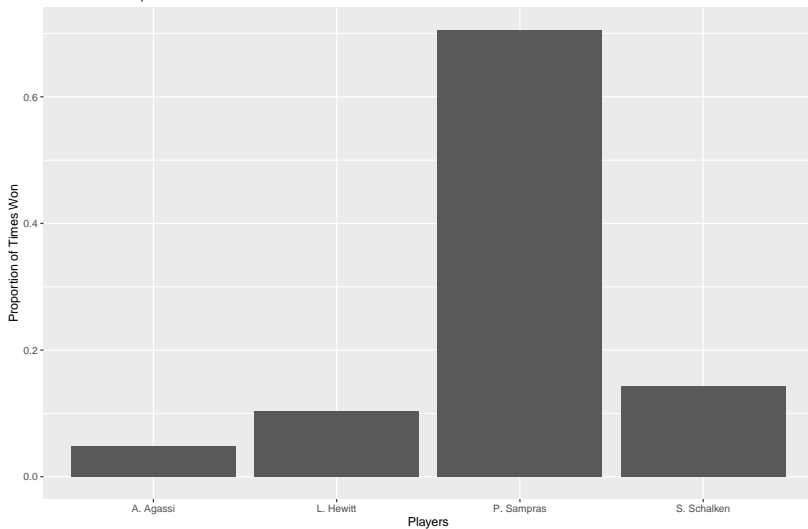
10		<b>Amélie Mauresmo</b>	3	7	4
2		<b>Venus Williams</b>	6	5	6

1		<b>Serena Williams</b>	6	6	
2		<b>Venus Williams</b>	4	3	

# 2002 U.S Open: Men

Which Player Won the Tournament?

2002 Men's US Open



# 2002 U.S Open: Men

## Semifinals

## Finals

1	 <b>Lleyton Hewitt</b>	4	6 <sup>5</sup>	7 <sup>7</sup>	2	
6	 <b>Andre Agassi</b>	6	7 <sup>7</sup>	6 <sup>1</sup>	6	

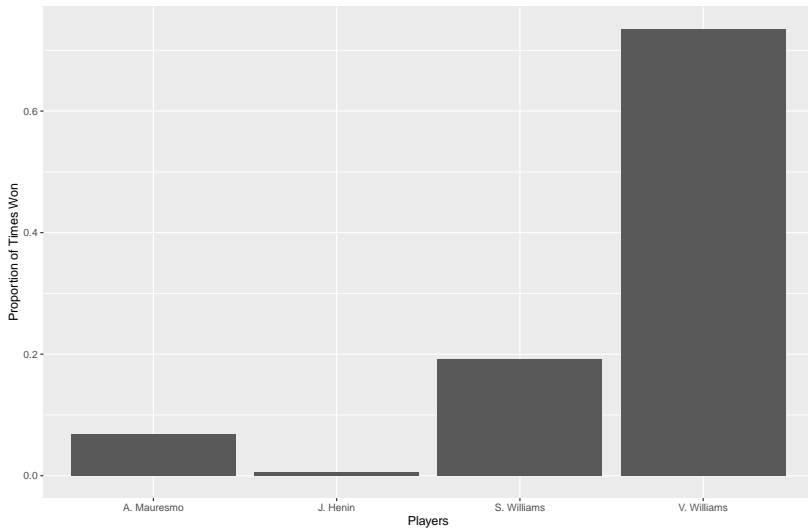
17	 <b>Pete Sampras</b>	7 <sup>8</sup>	7 <sup>7</sup>	6		
24	 <b>Sjeng Schalken</b>	6 <sup>6</sup>	6 <sup>4</sup>	2		

6	 <b>Andre Agassi</b>	3	4	7	4	
17	 <b>Pete Sampras</b>	6	6	5	6	

# 2002 Wimbledon: Women

Which Player Won the Tournament?



2002 Women's Wimbledon




# 2002 Wimbledon: Women

Semifinals

Final

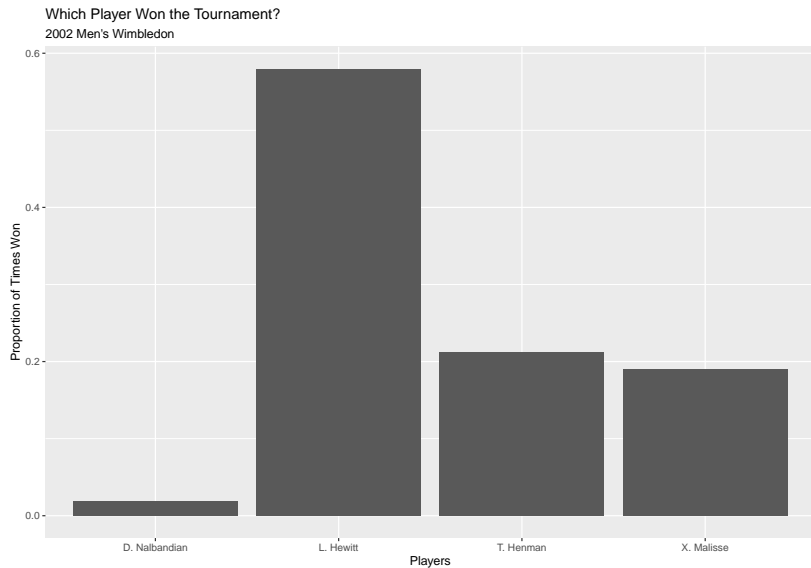
1		Venus Williams	6	6	
6		Justine Henin	3	2	

9		Amélie Mauresmo	2	1	
2		Serena Williams	6	6	

1		Venus Williams	6 <sup>4</sup>	3	
2		Serena Williams	7 <sup>7</sup>	6	







# 2002 Wimbledon: Men



# 2002 Wimbledon: Men

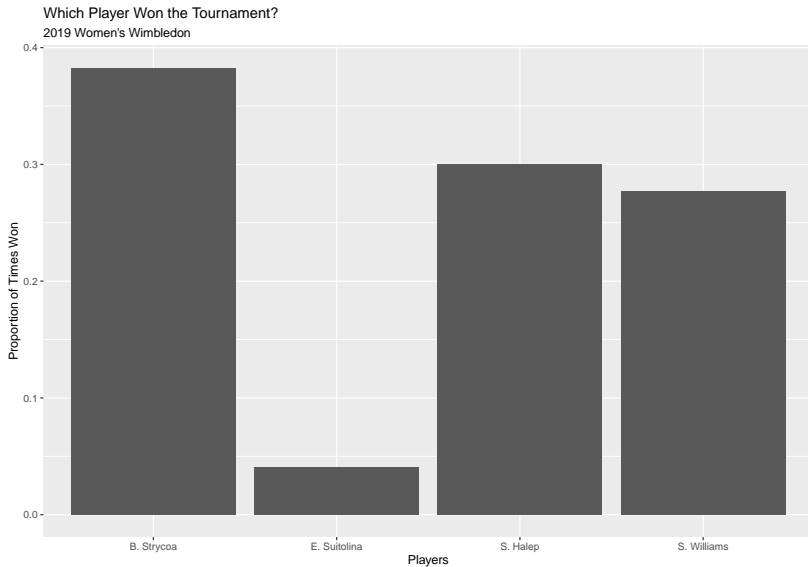
## Semifinals

1		Lleyton Hewitt	7	6	7		
4		Tim Henman	5	1	5		
27		Xavier Malisse	6 <sup>2</sup>	4	6	6	2
28		David Nalbandian	7 <sup>7</sup>	6	1	2	6

## Final

1		Lleyton Hewitt	6	6	6		
28		David Nalbandian	1	3	2		

# 2019 Wimbledon: Women



# 2019 Wimbledon: Women

## Semifinals

11		<b>Serena Williams</b>	6	6	
		<b>Barbora Strýcová</b>	1	2	
8		<b>Elina Svitolina</b>	1	3	
7		<b>Simona Halep</b>	6	6	

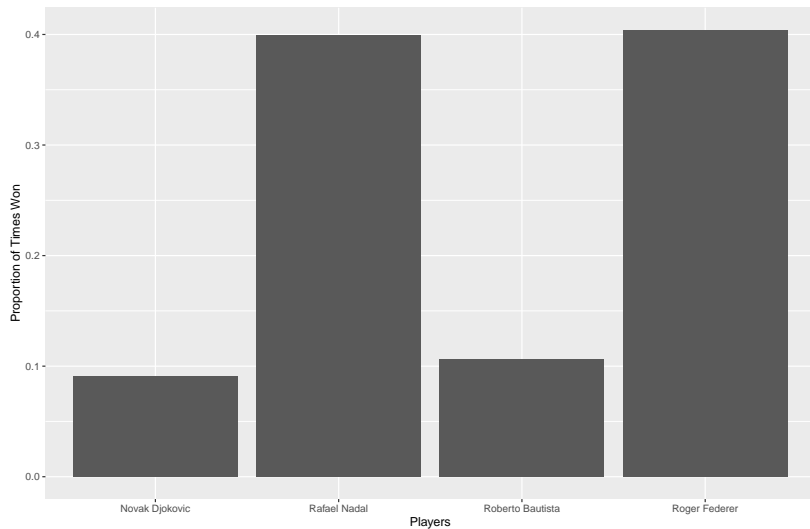
## Final

11		<b>Serena Williams</b>	2	2	
7		<b>Simona Halep</b>	6	6	

# 2019 Wimbledon: Men

Which Player Won the Tournament?

2002 Men's Wimbledon



# 2019 Wimbledon: Men

## Semifinals

## Final

1		<b>Novak Djokovic</b>	6	4	6	6	
23		Roberto Bautista Agut	2	6	3	2	
3		Rafael Nadal	6 <sup>3</sup>	6	3	4	
2		<b>Roger Federer</b>	7 <sup>7</sup>	1	6	6	

1		<b>Novak Djokovic</b>	7 <sup>7</sup>	1	7 <sup>7</sup>	4	13 <sup>7</sup>
2		<b>Roger Federer</b>	6 <sup>5</sup>	6	6 <sup>4</sup>	6	12 <sup>3</sup>