

The Longest Tennis Match in History

Probability and Statistics for Data Science

Carlos Fernandez-Granda



Tennis

Match divided into **sets**, divided into **games**, divided into **points**

- ▶ First player to win at least 4 points and lead **by 2**, wins game
- ▶ First player to win at least 6 games and lead **by 2**, wins set
- ▶ Exception: Tie-break (more on this later)
- ▶ In Grand Slams (e.g. Wimbledon), first player to win 3 sets wins the match
- ▶ Wimbledon 2023 final: 1-6, 7-6, 6-1, 3-6, 6-4

Longest matches before 2010

Smith/van Dillen vs Cornejo/Fillol: 7-9, 37-39, 8-6, 6-1, 6-3

Gonzales vs Pasarell: 22-24, 1-6, 16-14, 6-3, 11-9

Lara/Loyo-Mayo vs Santana/Garcia: 10-12, 24-22, 11-9, 3-6, 6-2

Drysdale/Moore vs Emerson/Barnes: 29-31, 8-6, 3-6, 8-6, 6-2

Wimbledon 2010 First Round



$70 + 68 = 138$ games! (8 hours 11 minutes!)

Why did this happen?

Why had it never happened before? (previous longest: 76 games)

Player who starts the point (**serves**) has an advantage over player who **returns**



Image credit: y.caradec (Wikipedia)

Our match



Out of the 183 games, serving player won 180

Why did this happen?

Because both players:

- ▶ Served very well
- ▶ Returned very badly

As a result, they *took turns* winning their serves for many games

How can we make this precise?

Estimate

$P(138 \text{ or more games in a set})$

under reasonable assumptions

Probability quantifies how often such a long set should happen

Challenge:

How to estimate this probability

Strategy: First estimate probability of winning a point

Point win %

	Serve	Return	Our match	
			Serve	Return
Djokovic	68	42		
de Minaur	64	40		
Rune	65	37		
Munar	61	39		
Isner	72	30	76.2	21.3
Mahut	64	34	78.7	23.8

Challenge

We have estimated

$$P(\text{Isner wins serve point}) = 0.762$$

$$P(\text{Mahut wins serve point}) = 0.787$$

How do we compute

$$P(138 \text{ or more games in a set}) ?$$

Let's try

Assumptions: Points are **independent** and **identically distributed**

$$P(138 \text{ or more games}) = P(138 \text{ games}) + P(139 \text{ games}) + \dots$$

$$P(138 \text{ games})$$

$$= P(\text{Isner wins 1st game}) P(\text{Mahut wins 2nd game}) \dots P(\text{Mahut wins 138th game})$$

$$+ P(\text{Isner wins 1st game}) P(\text{Isner wins 2nd game}) \dots P(\text{Mahut wins 138th game})$$

$$+ \dots$$

$$+ P(\text{Mahut wins 1st game}) P(\text{Isner wins 2nd game}) \dots P(\text{Isner wins 138th game})$$

$$P(\text{Isner wins 1st game})$$

$$= P(\text{Isner wins 1st point}) P(\text{Isner wins 2nd point}) \dots P(\text{Isner wins 4th point})$$

$$+ P(\text{Isner wins 1st point}) P(\text{Mahut wins 2nd point}) \dots P(\text{Isner wins 5th point})$$

$$+ \dots$$

Not impossible, but painful...

However, simulating is easy!

However, simulating is easy!

```
def simulate_game(win_prob_serve):
    points_1 = 0
    points_2 = 0
    while (points_1 < 4 and points_2 < 4)
        or np.abs(points_1 - points_2) < 2:
        if rng.random() < win_prob_serve:
            points_1 += 1
        else:
            points_2 += 1
    if points_1 > points_2:
        # Player who serves wins
        outcome = 1
    else:
        # Player who receives wins
        outcome = 0
    return outcome
```

Simulating is easy!

```
def simulate_set(win_prob_serve_1, win_prob_serve_2):  
    games_1 = 0  
    games_2 = 0  
    who_serves = 1  
    if rng.random() < 0.5:  
        who_serves = 2  
    while (games_1 < 6 and games_2 < 6)  
        or np.abs(games_1 - games_2) < 2:  
        if who_serves == 1:  
            if simulate_game(win_prob_serve_1) == 1:  
                games_1 += 1  
            else:  
                games_2 += 1  
        who_serves = 2
```

Simulating is easy!

```
else:
    if simulate_game(win_prob_serve_2)==1:
        games_2 += 1
    else:
        games_1 += 1
    who_serves = 1
return [games_1,games_2]
```


Intuitive definition of probability

$$P(\text{event}) = \frac{\text{number of times event occurs}}{\text{total repetitions}}$$

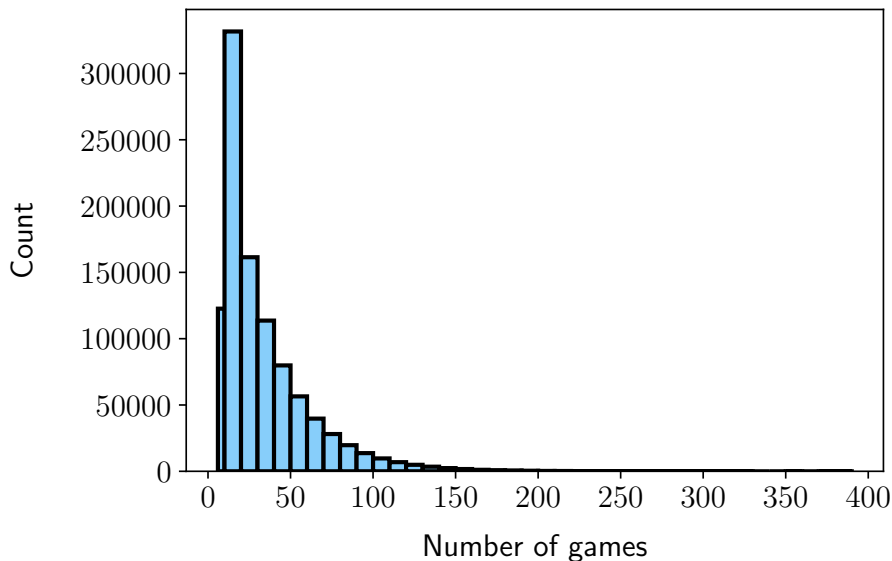
Monte Carlo method

1. Generate m simulations
2. Compute the fraction of simulation where event happens,

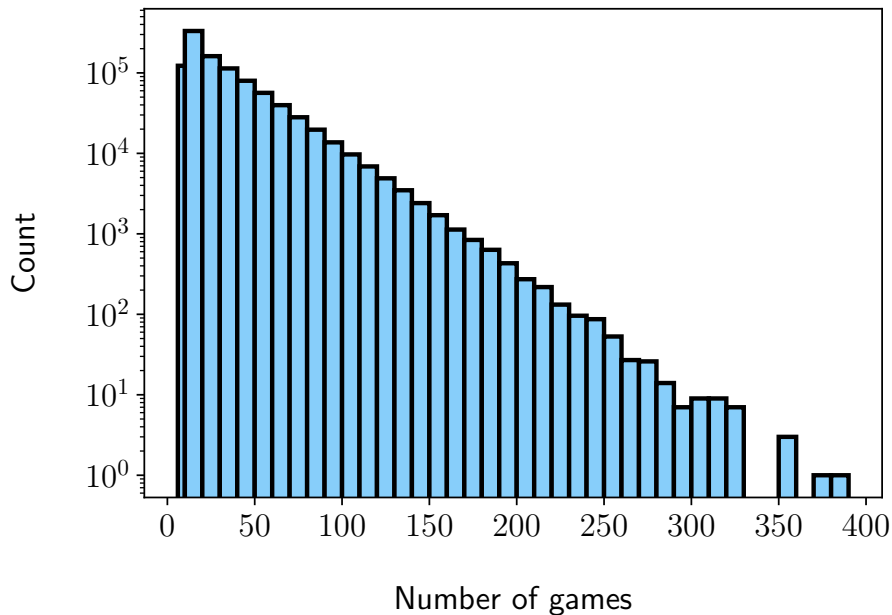
$$P_{\text{MC}}(\text{event}) := \frac{\text{number of times event occurs}}{m}$$

Converges to true probability as $m \rightarrow \infty$ by law of large numbers

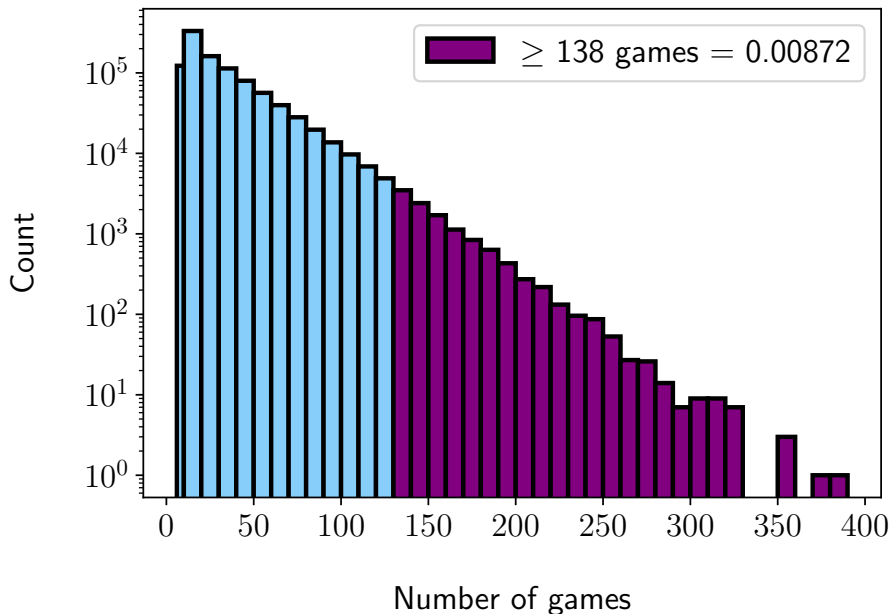
One million simulations



One million simulations



$$P(138 \text{ or more games}) = 0.872\%$$



Side note: Allows to predict match outcome!

Based on the one million simulations

$$P(\text{Isner wins match}) = 0.387$$

Challenge:

Requires estimating point win % **before** the match

Estimated serve-point win %

Do we trust these estimates?

$$P(\text{Isner wins serve point}) = 0.762$$

$$P(\text{Mahut wins serve point}) = 0.787$$

Depends on sample size

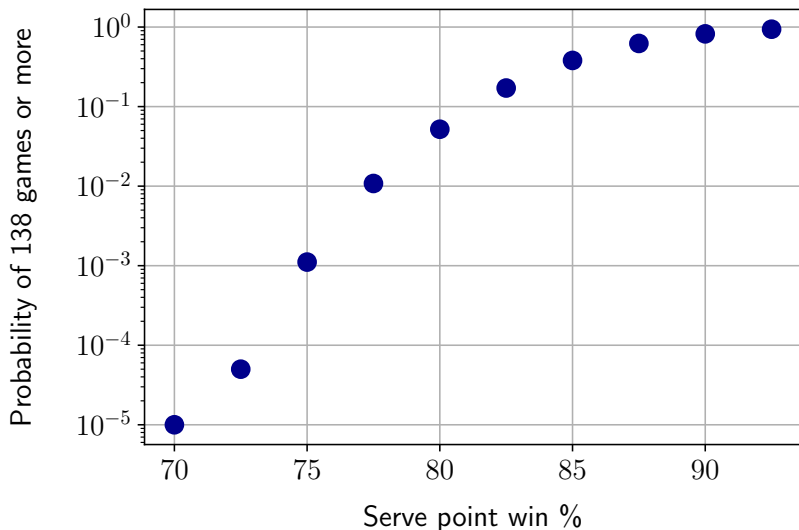
We can use 0.95 confidence intervals to quantify uncertainty

Assuming points are independent

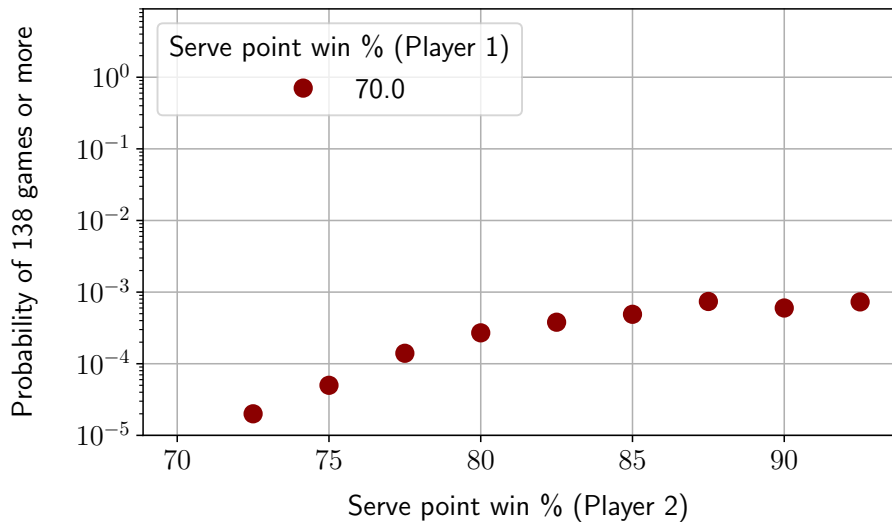
► Isner: [71.7, 80.6] ($n = 491$)

► Mahut: [74.3, 83.2] ($n = 489$)

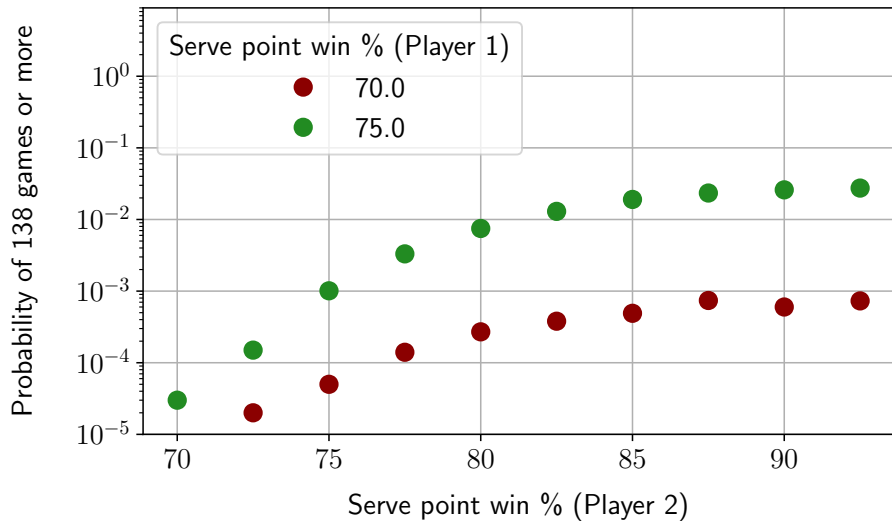
If both players have same serve-point win %



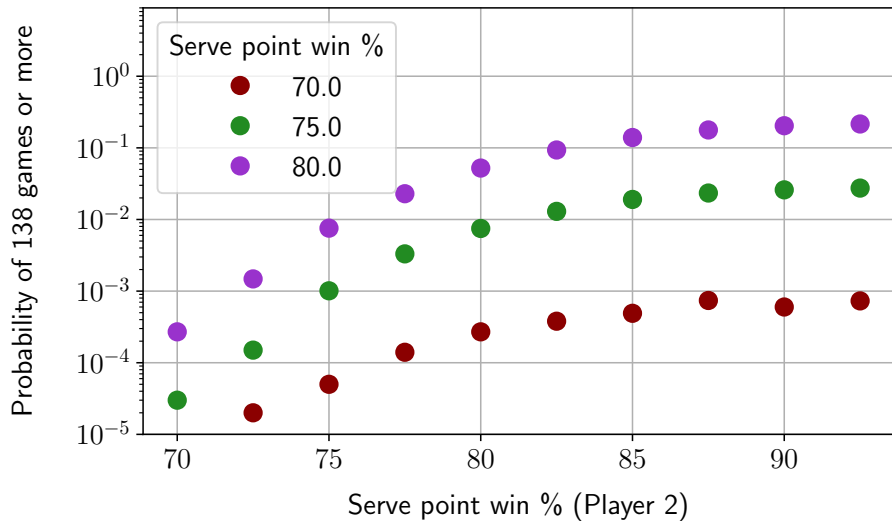
Different serve-point win %



Different serve-point win %



Different serve-point win %



Why did this happen only once?

Strategy:

Determine how many **similar match-ups** there were before 2010

Compute probability of ≥ 138 games happening **exactly once**

Similar match-ups

We identify strong servers / weak returners (*servebots*)

According to ChatGPT:

John Newcombe (1967-1979), Stan Smith (1968-1978), Clark Graebner (1965-1975), Roscoe Tanner (1972-1985), Kevin Curren (1980-1993), Slobodan Zivojinovic (1981-1997), Goran Ivanisevic (1990-2004), Richard Krajicek (1989-2003), Greg Rusedski (1991-2007), Marc Rosset (1988-2005), Mark Philippoussis (1994-2008), Wayne Arthurs (1990-2007), Joachim Johansson (2000-2009), Ivo Karlovic (2000-2022), John Isner (2007-2023), Mario Ancic (2001-2011), Sam Querrey (2006-2022), Taylor Dent (1998-2010), Nicolas Mahut (2000-2023)

Tie breaks

- ▶ Played when set score is 6 - 6
- ▶ Decisive game that ends the set
- ▶ Widespread since 1970s, except for final deciding set in some cases (e.g. Wimbledon)

Important reason why there haven't been more very long sets

How many sets without tie-breaks between

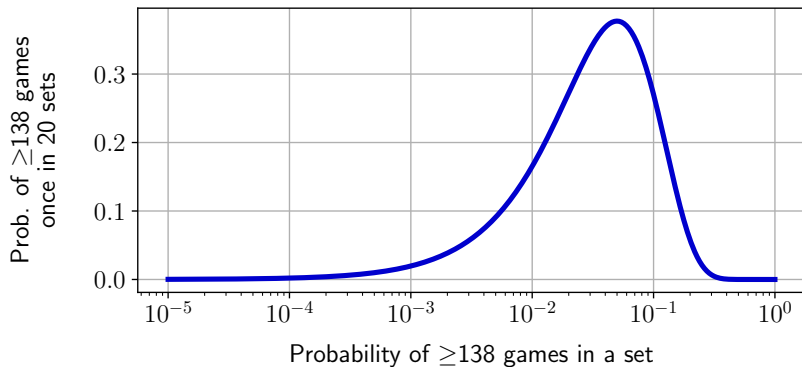
John Newcombe (1967-1979), Stan Smith (1968-1978), Clark Graebner (1965-1975), Roscoe Tanner (1972-1985), Kevin Curren (1980-1993), Slobodan Zivojinovic (1981-1997), Goran Ivanisevic (1990-2004), Richard Krajicek (1989-2003), Greg Rusedski (1991-2007), Marc Rosset (1988-2005), Mark Philippoussis (1994-2008), Wayne Arthurs (1990-2007), Joachim Johansson (2000-2009), Ivo Karlovic (2000-2022), John Isner (2007-2023), Mario Ancic (2001-2011), Sam Querrey (2006-2022), Taylor Dent (1998-2010), Nicolas Mahut (2000-2023)

According to ChatGPT: Only 20

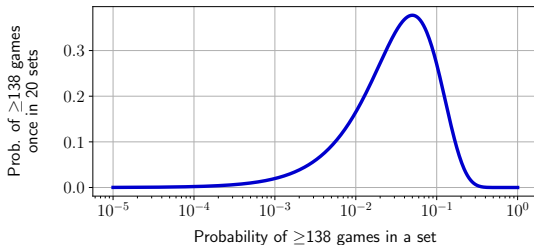
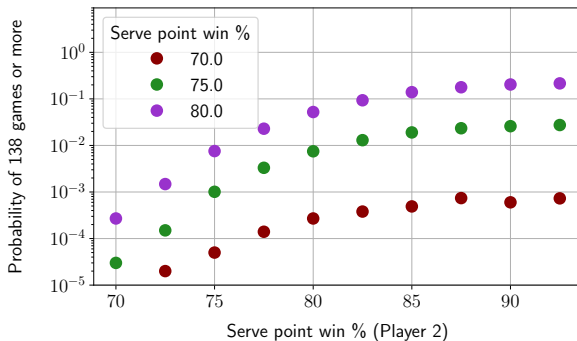
$P(\geq 138 \text{ games exactly once})$

If $P(138 \text{ or more games}) := \theta$

$$P(\geq 138 \text{ games once in 20 sets}) = 20 \theta (1 - \theta)^{19}$$



Isner: [71.7, 80.6] Mahut: [74.3, 83.2]



Conclusion

A match with 138 (or more) games occurs with *non-negligible probability* if both players are **strong servers** / **weak returners**

Consequently, given number of sets **without tie-breaks** between such players observing *just one* such game is **plausible**

Under the assumption that points are independent and identically distributed (e.g. ignoring fatigue)