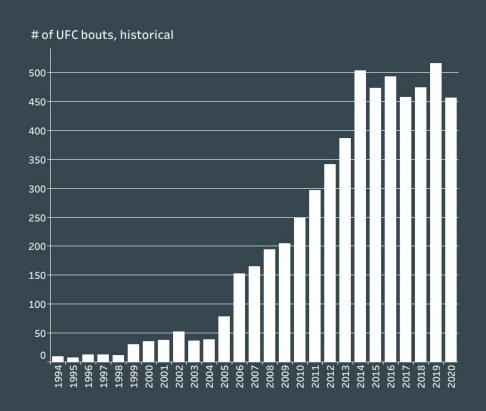
Improving risk management for moneyline betting on UFC fights



Ultimate Fighting Championship ("UFC")

- Explosive growth in popularity in recent years
- Growing revenue share for DraftKings



Bookmaking for sports betting is about risk management

Moneyline for Ronda Rousey vs. Holly Holm

Ronda Rousey (Tavorite)	-750 (probability to will 88%)	if won, \$750 bet pays out \$100 (excl. principle)
Holly Holm (underdog)	+525 (probability to win 16%)	if won, \$100 bet pays out \$525

Simplified example of cash flow among 3 bets:

Over-round ("expected profit")

2 bets on Ronda Rousey + 1 bet on Holly Holm	→ DraftKings collects	\$1,600	2 * \$750 + 1 * \$100	= \$1,600
Expected payout: \$1,600 - 2 bets for Ronda	ightarrow Expected return is	(\$100)	\$1,600 - 2 * (\$750 + \$100)	= -\$100
Actual result is upset: \$1,600 - 1 bet for Holly	ightarrow Actual return is	\$975	\$1,600 - (\$525 + \$100)	= \$975
Due to the upset result, DraftKings exceeded target	→ Target is	\$64	\$1,600 * 4%	= \$64

Surprise	
About 1/3 of the time	
* based on processed dataset	

Michael Johnson Donald Cerrone Tim Boetsch Carlos Condit Rafael Dos Anjos Charles Oliveira Jeremy Stephens Diego Sanchez Mauricio Rua Jan Blachowicz Ben Rothwell

Total upsets*

Total fights*

15

10

10

10

9

9

9

8

8

8

8

8

1,978

2,161

% of upset

79%

33%

56%

71%

36%

38%

43%

53%

56%

69%

75%

36% 42%

44%

50%

67%

26%

29%

35%

41%

44%

Average 34%

19

30

18

14

25

24

21

17

16

13

12

22

19

18

16

12

27

24

20

17

16

5,878

6,278

Fighter name

Ross Pearson

Darren Elkins

Neil Magny

Thiago Alves

Demian Maia Matt Brown

Cub Swanson

Sum total

Dennis Bermudez

Other (1,279 fighters)

Jim Miller

Johny Hendricks

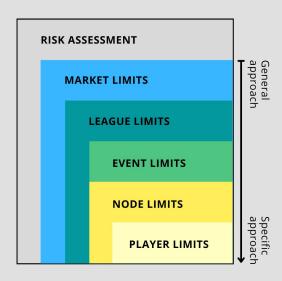
Improving your risk & revenue metrics

Build a predictive model

What is the likelihood of a fight to result in an upset?

Measures of success

- Improved tracking error and lowered value-at-risk
- Accurate identification of upsets



Key elements

Collect dataset of previous fight statistics & betting odds



Data analysis



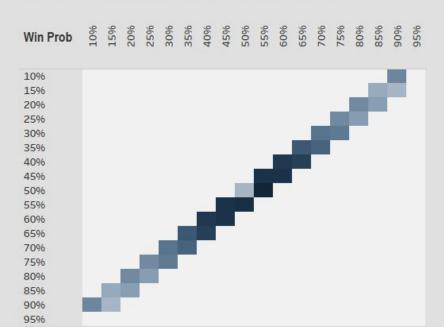
Predictive modeling to identify the upsets

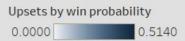


Adjust odds in guidance with the predictive model outputs

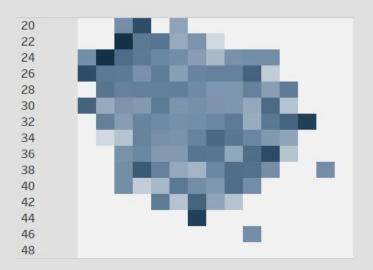
Exploring the upsets

Upsets as % of all fights, by implied win probability*





Age Bin 20 22 24 26 28 30 32 34 36 38 40 42 44 46 48





Upsets as a % of all fights, by fighter ages**

^{*} derived from odds

^{**} filtered for fighter-pairs with more than 2 fights

Potential

Sentiment analysis

Analyze online sentiment and flow of money to understand the drivers for changes in the odds for the duration that they are offered in the market

Competitor analysis

Using the historical odds listed by the competitors, build a model that maximizes revenue

Q&A

Appendix - Moneyline Betting

Khabib Nurmagomedov (title defense) / Conor McGregor (underdog)



If McGregor won, \$165 would have been paid out for every \$100 bet

Nurmagomedov won, so \$100 was paid out for every \$191 bet

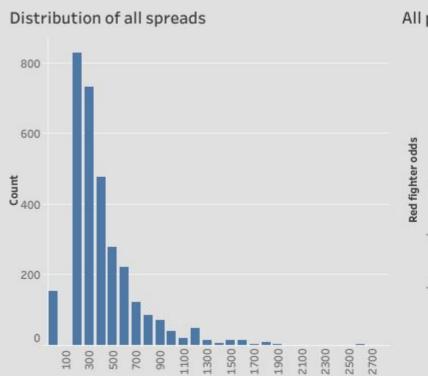
Appendix - Moneyline Betting

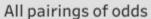
Khabib Nurmagomedov / Conor McGregor

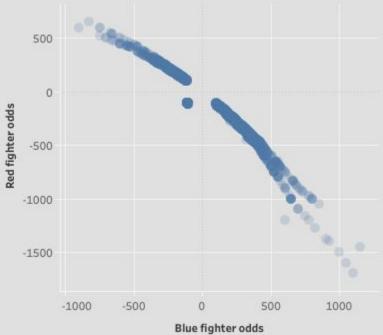




Appendix - EDA

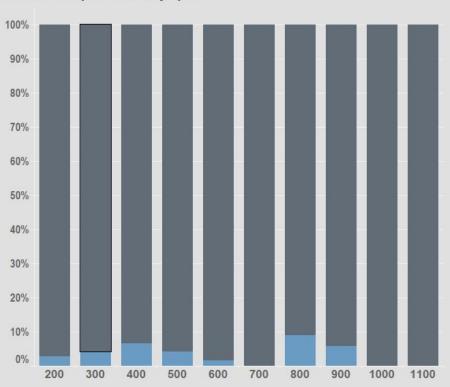






Appendix - EDA

Number of upsets in %, by spread



Number of upsets in %, by fight type

