USOpen2019

February 1, 2020

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!!! NEED LINKS TO WEBSITE AND SEABORN THEME/PALLATTE !!!

1 US Open 2019 Analysis

May 17, 2019

This analysis aims to generate as comprehensive as possible summary of the event. Feel free to skip around and only view parts of the report that are interesting to you. Visualizations are presented in addition to tables and narrations.

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1.1 Individual Analysis

Top/bottom performances are mostly ranked on Action per Minute (APM), Neutral Pace Factor(NPF), and Results. Emphasis is placed on these metrics because APM and NPF have been shown to be highly correlated with long-term success (r=0.92, r=0.88 respectively). The following section focuses on wrestlers' performances across the entire tournament and requires three or more matches to be included. Top performances for individual matches can be found further below.

1.1.1 Top Perfomers

Top performers for this event are (in order): 1. Justin Deangelis – 70 kgs 2. Lavion Mayes – 70 kgs 3. Yianni Diakomihalis – 65 kgs

These wrestlers more than doubled the average APM for the event and competed for roughly 5 minutes (299 seconds) on average between them. They scored an average of 10.2 points and held their opponents to 5.8 for a 4.35 MoV. Interestingly, Justin and Yianni both had negative Passive differentials, but maintained a 4.2 and 6.6 MoV compared to Lavion's 2.3 MoV average.

Key perfomance metrics between all wrestlers and the top performers:

	All	Тор
APM	11.552341	22.200000
NPF	1.002481	1.212667
NumResult	0.911035	1.066667

Additional metrics for Top Performers:

	APM	NPF	NumResult	Duration	PassiveDiff	FocusPoints	\
Focus							
Justin Deangelis	23.0	1.296	1.18	269.0460	-0.60	10.00	
Lavion Mayes	23.0	1.130	1.10	290.5375	0.25	10.75	
Jesse Delgado	20.6	1.212	0.92	291.3860	0.00	11.20	
	OppPo	ints	MoV				
Focus							
Justin Deangelis		5.8	4.20				
Lavion Mayes		8.5	2.25				
Jesse Delgado		11.0	0.20				

1.1.2 Bottom Performers

In this section it is important to remember that these wrestlers still competed three times, meaning they won at least one match and thus are **not** the *absolute* worst performers in the event. Bottom performers for this event are (in order): 1. Chance Goodman - 79kgs 2. Blake McNall - 65kgs 3. Fernando Serje - 92kgs

These wrestlers all averaged an APM of only 0.89 and a NPF score of 0.089. They were never turned and limited their opponents' NPF scores to only 1.02. All three of these wrestlers went 1-2 on the weekend with one Decision win and two Losses by Technical Superiority.

Key perfomance metrics between ALL wrestlers and the Bottom Performers:

	All	Bottom
APM	11.552341	3.666667
NPF	1.002481	0.794444
NumResult	0.911035	0.633333

Additional metrics for Bottom Performers:

Patrick Romero	3.333333	0.916667	0.583333	113.080000	-0.666667
Anthony Ashnault	3.666667	0.966667	0.733333	250.943333	0.666667
Kyle Kintz	4.000000	0.500000	0.583333	84.226667	0.000000

	FocusPoints	${\tt OppPoints}$	MoV
Focus			
Patrick Romero	1.0	7.666667	-6.666667
Anthony Ashnault	2.0	5.000000	-3.000000
Kyle Kintz	2.0	7.333333	-5.333333

1.1.3 Top Individual Match Performance

These sections focus on individual matches for all wrestlers who competed in the event. Analysis will still favor the KPMs (Key Performance Metrics: APM and NPF).

There were 100 matches that resulted in a Win by Fall.

There were 88 matches with the maximum NPF of 2.0.

Of these, 11 matches resulted in an NPF of 2.0 and a Win by Fall.

There were 2 matches with an APM greater than 3 standard deviations from the event mean of 10.32.

None of the 2 matches with an APM > 31 resulted in a Fall...

	Result N	MatchID	Focus	Opponent	NPF	APM	Duration	\
190	${\tt WinD}$	8020	Tyler Graff	Cody Brewer	1.15	40.0	360.04	
350	${\tt WinTF}$	IFHT	Riley Lefever	Enock Francois	1.16	35.0	333.23	
1011	${\tt WinD}$	FJ80*	Justin Deangelis	Lavion Mayes	1.22	34.0	363.37	
	FocusPo	oints O	ppPoints					
190		22	16					
350		23	12					
1011		16	11					

11 matches with a WinF result and 2.0 NPF.

	Result	${\tt MatchID}$	Focus	Opponent	NPF	APM	\
843	WinF	HTMU*	Elroy Perkin	Joshua Kindig	2.0	12.0	
669	WinF	DXNJ*	Conrad Cole	Ernesto Garcia	2.0	11.0	
1598	WinF	PPH7*	Michael Macchiavello	Timothy Dudley	2.0	10.0	
763	WinF	V8TQ	Joshua Asper	David Richardson	2.0	9.0	
1400	${\tt WinF}$	SY70	Matthew Malcom	Austin Farbaugh	2.0	8.0	
544	${\tt WinF}$	U72K*	Cameron Caffey	Jake Posey	2.0	7.0	
955	${\tt WinF}$	QW3W	Geno Morelli	Kyle Matthews	2.0	6.0	
524	${\tt WinF}$	DQW8*	Nikko Reyes	Nicholas Nottingham	2.0	5.0	
652	${\tt WinF}$	KY05	Nathan Jackson	Ethan Vistro	2.0	5.0	
997	WinF	M8Q4*	Noel Orozco	Kyle La Fritz	2.0	5.0	

1165	WinF	5N6D* Ja	rrod Hinrichs	Kyle Jennings	2.0	5.0
	Duration	FocusPoints	OppPoints			
843	95.74	. 8	0			
669	54.80	8	0			
1598	263.87	9	0			
763	36.90	8	0			
1400	67.43	6	0			
544	88.74	4	0			
955	17.42	4	0			
524	30.53	4	0			
652	12.70	4	0			
997	18.71	4	0			
1165	21.41	4	0			

From these two lists of matches it is clear that there are many great performances to choose from. The Perkin WinF over Kindig is tempting as it has the highest APM of any match with a 2.0 NPF and WinF result. However, the Cole WinF over Garcia seems a stronger contender as it has roughly the same APM and was finished in half the time (55 seconds versus 96 seconds).

Ultimately I will drop both of these options in favor of the 40.0 APM Graff WinD over Brewer. This match was a 38 point storm that resulted in the highest APM of the tournament despite a relateively even NPF (1.15 for Graff).

> Caveat: The second highest APM of 30.0 in the Glynn WinTF over Hessler was tempting as most metrics are the same (another 30 point match) or better (1.24 NPF for Glynn), but you don't get points for second place.

1.2 Weight Class Analysis

1.2.1 57 kilos 69 matches

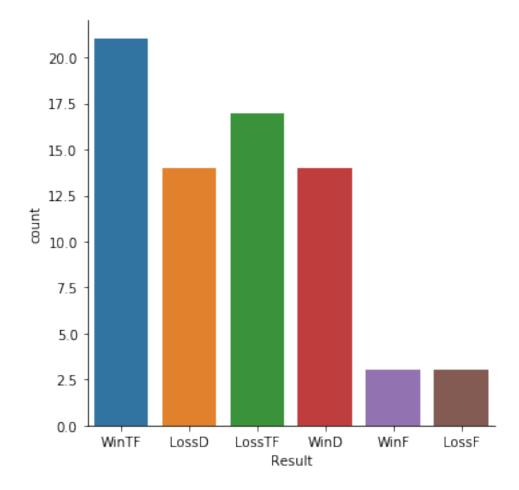
Placements

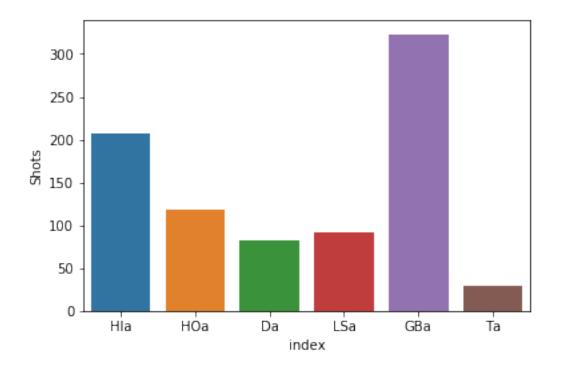
- 1. Daton Fix
- 2. Thomas Gilman
- 3. Zane Richards
- 4. Vitali Arujau
- 5. Darian Cruz
- 6. Nathan Tomasello
- 7. Frank Perrelli
- 8. Zach Sanders

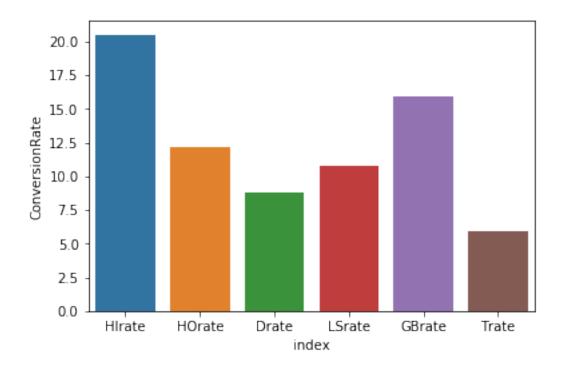
Distributions This section focuses on illustrating the distribution of Results and ShotTypes for this event.

Techs are the most common result followed by Decisions and then Falls as is typical with a Freestyle event.

Distributions of match results.

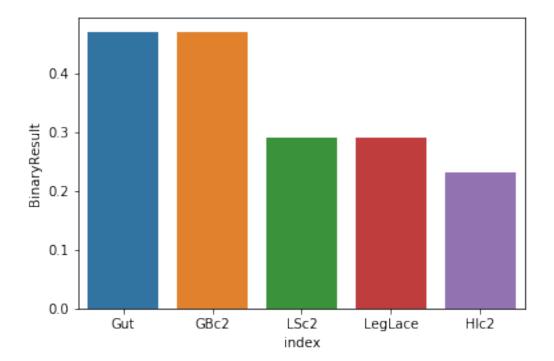






Remember correlations range from -1 to +1 the former representating a strong relationship with a negative outcome (in this case losing the match) and the latter representation a strong relationship with a positive outcome (i.e. winning a match). Correlations closer to 0 represent weak relationships and correlations around 0.5 represent moderate relationships.

Top actions for 57kgs at this event.

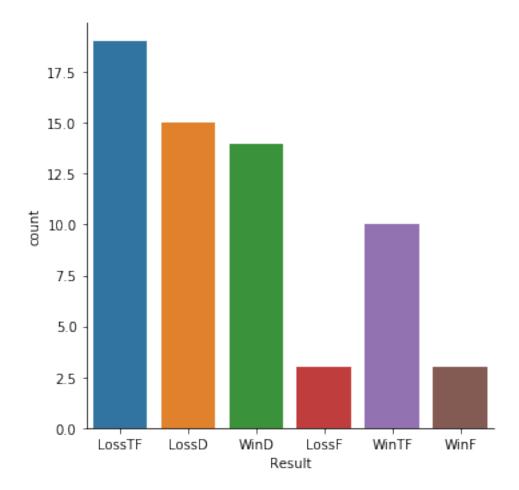


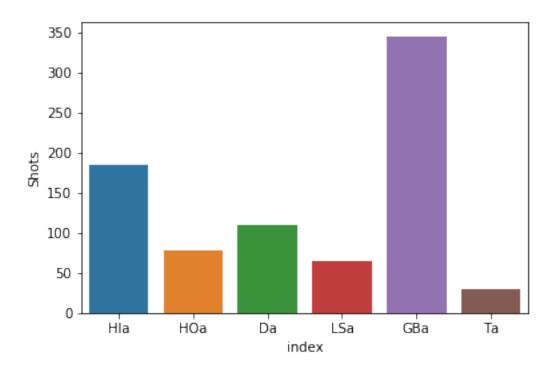
1.2.2 61 kilos 61 matches

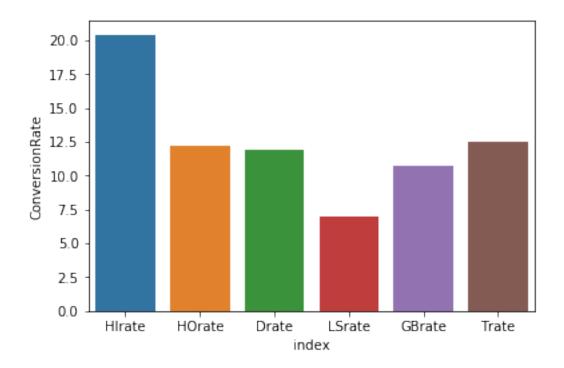
- 1. Cody Brewer
- 2. Nico Megaludis
- 3. Joey Palmer
- 4. Tyler Graff
- 5. Cory Clark
- 6. Anthony Ramos
- 7. Earl Hall
- 8. Beau Bartlett

Techs are the most common result followed by Decisions and then Falls as is typical with a Freestyle event.

Distributions of match results.

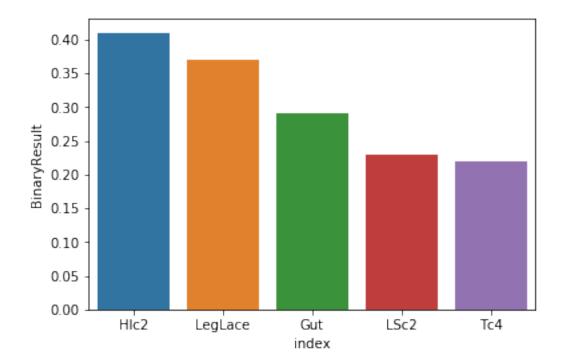






Remember correlations range from -1 to +1 the former representating a strong relationship with a negative outcome (in this case losing the match) and the latter representation a strong relationship with a positive outcome (i.e. winning a match). Correlations closer to 0 represent weak relationships and correlations around 0.5 represent moderate relationships.

Top actions for 61kgs at this event.

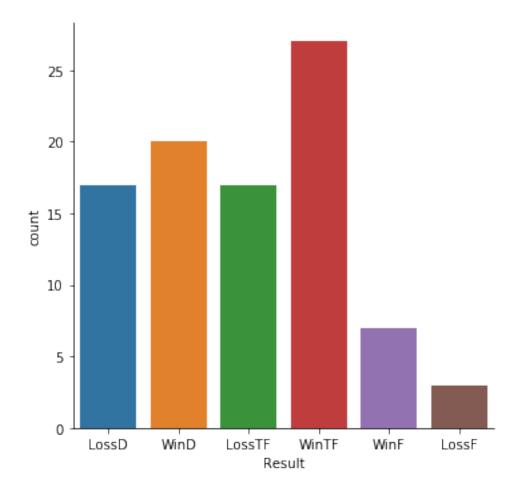


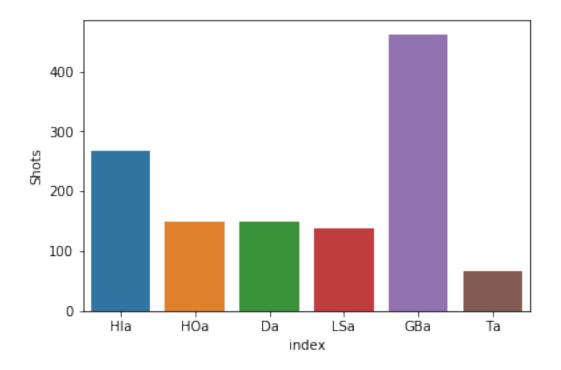
1.2.3 65 kilos 92 matches

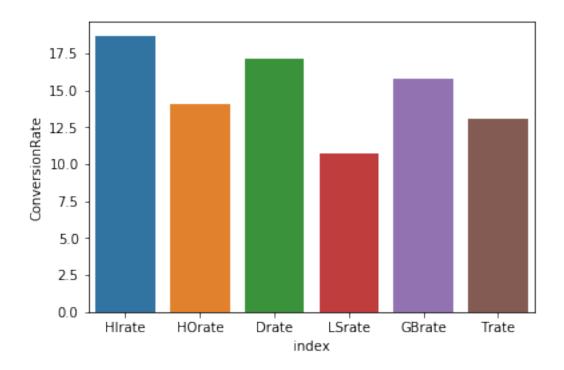
- 1. Yianni Diakomihalis
- 2. Zain Retherford
- 3. Jason Ness
- 4. Frank Molinaro
- 5. Jaydin Eirman
- 6. Jordan Oliver
- 7. Kanen Storr
- 8. Bernard Futrell

Techs are the most common result followed by Decisions and then Falls as is typical with a Freestyle event.

Distributions of match results.

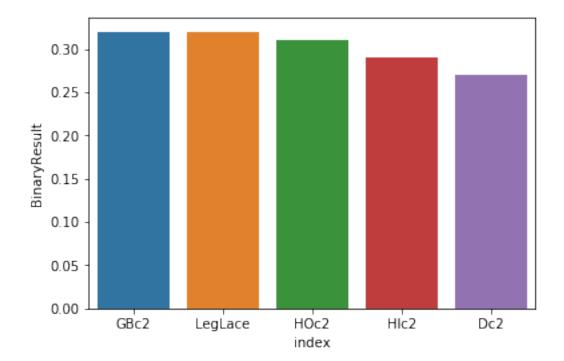






Remember correlations range from -1 to +1 the former representating a strong relationship with a negative outcome (in this case losing the match) and the latter representation a strong relationship with a positive outcome (i.e. winning a match). Correlations closer to 0 represent weak relationships and correlations around 0.5 represent moderate relationships.

Top actions for 65kgs at this event.

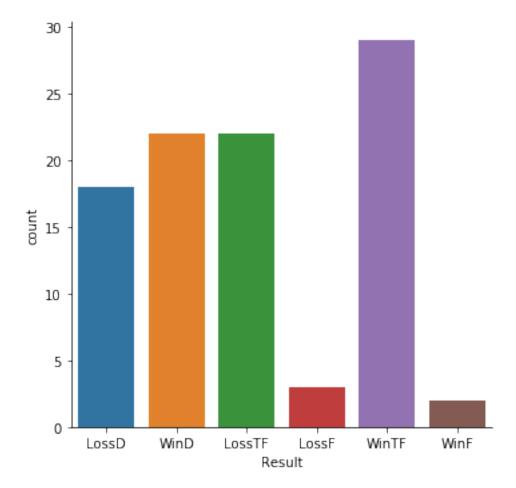


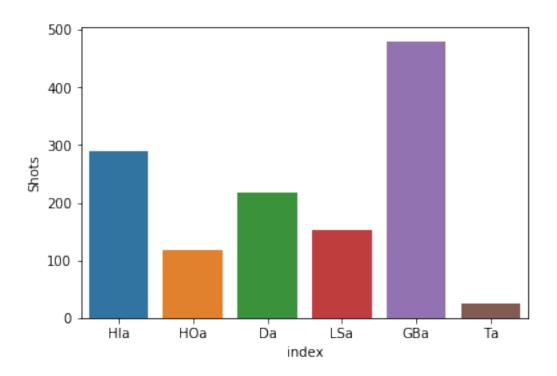
1.2.4 70 kilos 96 matches

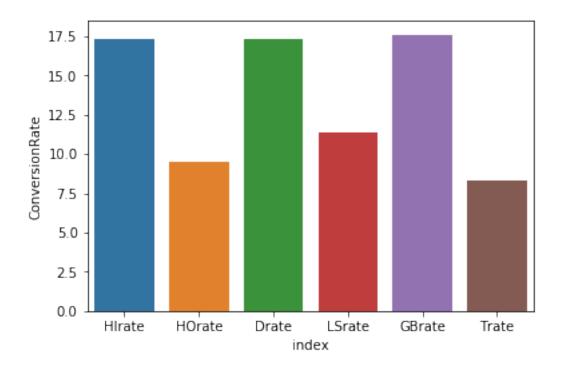
- 1. Ryan Deakin
- 2. James Green
- 3. Jason Nolf
- 4. Alec Pantaleo
- 5. Brandon Sorensen
- 6. Nazar Kulchytskyy
- 7. Jason Chamberlain
- 8. Anthony Collica

Techs are the most common result followed by Decisions and then Falls as is typical with a Freestyle event.

Distributions of match results.

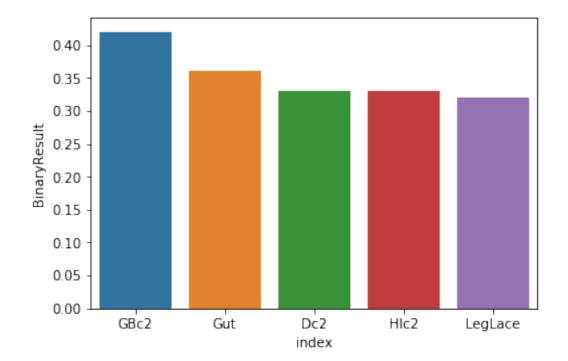






Remember correlations range from -1 to +1 the former representating a strong relationship with a negative outcome (in this case losing the match) and the latter representation a strong relationship with a positive outcome (i.e. winning a match). Correlations closer to 0 represent weak relationships and correlations around 0.5 represent moderate relationships.

Top actions for 70kgs at this event.

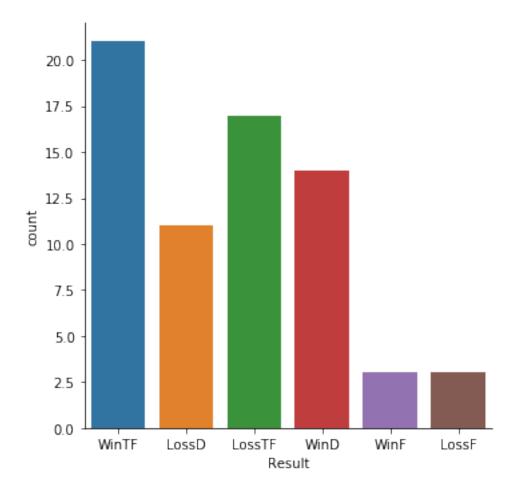


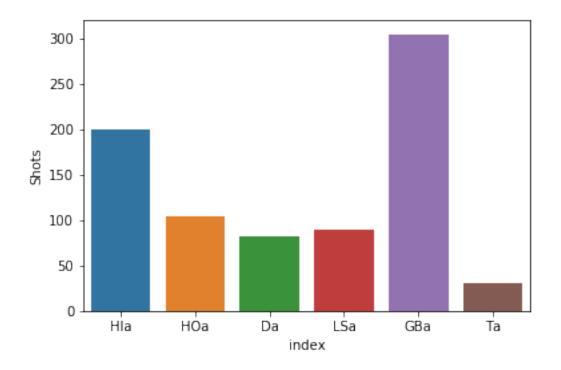
1.2.5 74 kilos 69 matches

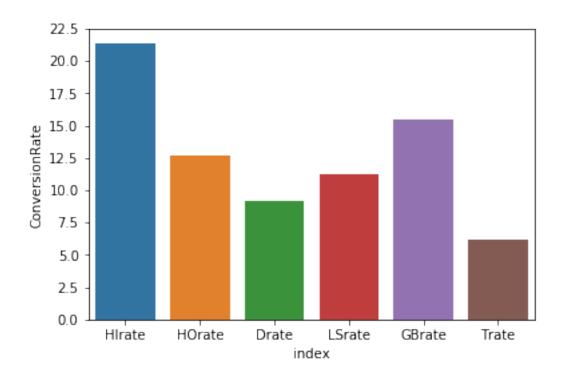
- 1. Daton Fix
- 2. Thomas Gilman
- 3. Zane Richards
- 4. Vitali Arujau
- 5. Darian Cruz
- 6. Nathan Tomasello
- 7. Frank Perrelli
- 8. Zach Sanders

Techs are the most common result followed by Decisions and then Falls as is typical with a Freestyle event.

Distributions of match results.

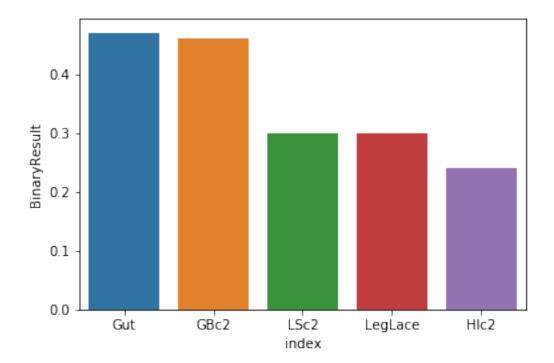






Remember correlations range from -1 to +1 the former representating a strong relationship with a negative outcome (in this case losing the match) and the latter representation a strong relationship with a positive outcome (i.e. winning a match). Correlations closer to 0 represent weak relationships and correlations around 0.5 represent moderate relationships.

Top actions for 57kgs at this event.

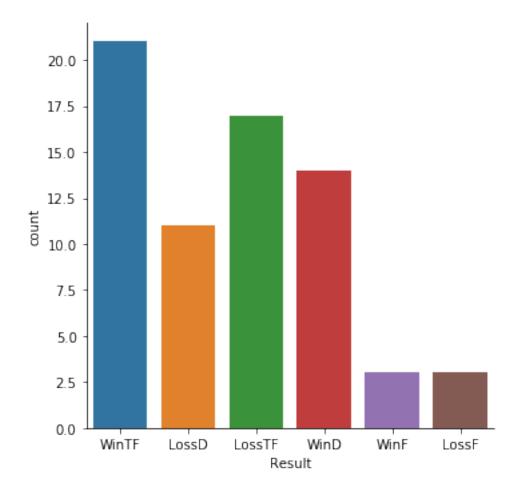


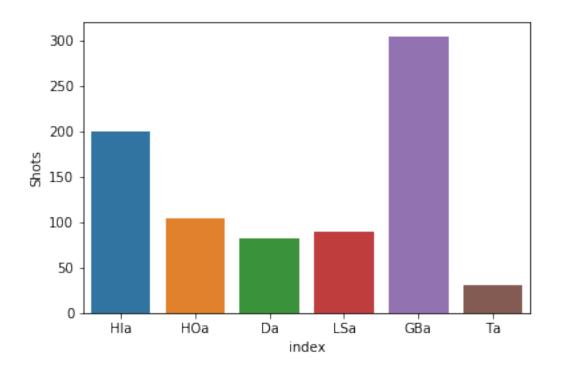
1.2.6 79 kilos 69 matches

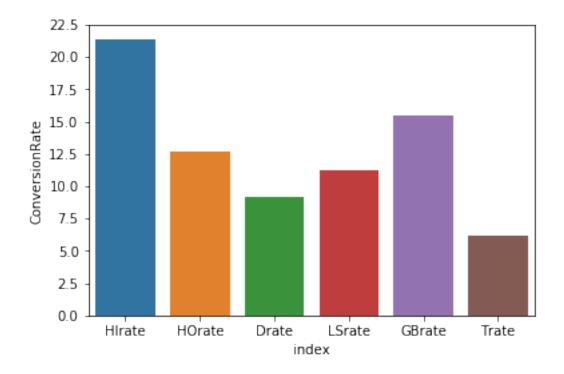
- 1. Daton Fix
- 2. Thomas Gilman
- 3. Zane Richards
- 4. Vitali Arujau
- 5. Darian Cruz
- 6. Nathan Tomasello
- 7. Frank Perrelli
- 8. Zach Sanders

Techs are the most common result followed by Decisions and then Falls as is typical with a Freestyle event.

Distributions of match results.

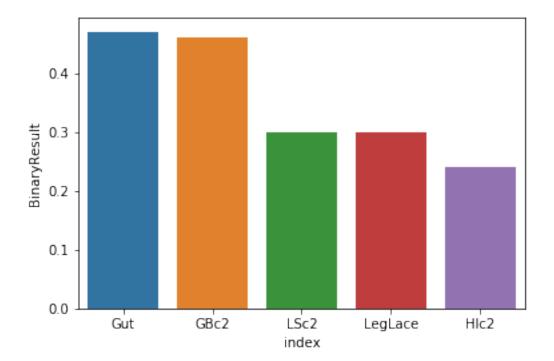






Remember correlations range from -1 to +1 the former representating a strong relationship with a negative outcome (in this case losing the match) and the latter representation a strong relationship with a positive outcome (i.e. winning a match). Correlations closer to 0 represent weak relationships and correlations around 0.5 represent moderate relationships.

Top actions for 57kgs at this event.

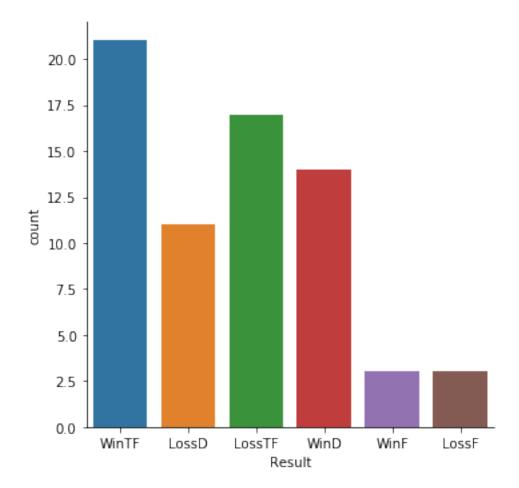


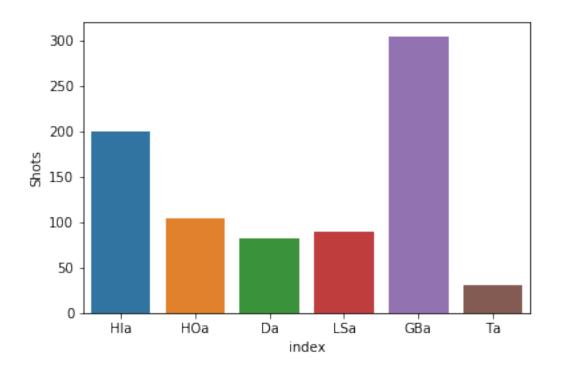
1.2.7 86 kilos 69 matches

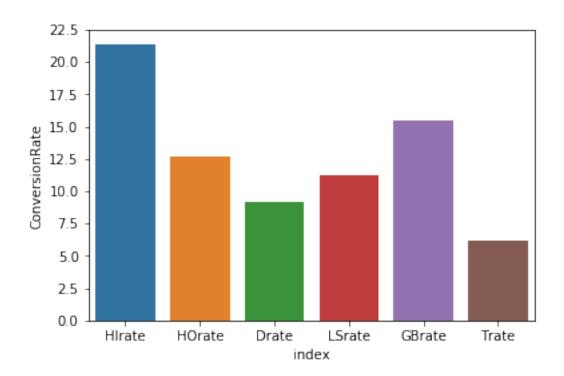
- 1. Daton Fix
- 2. Thomas Gilman
- 3. Zane Richards
- 4. Vitali Arujau
- 5. Darian Cruz
- 6. Nathan Tomasello
- 7. Frank Perrelli
- 8. Zach Sanders

Techs are the most common result followed by Decisions and then Falls as is typical with a Freestyle event.

Distributions of match results.

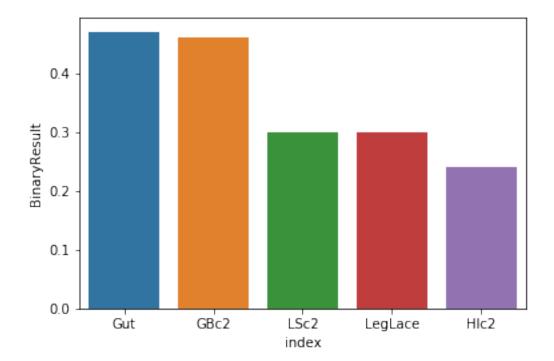






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Top actions for 57kgs at this event.

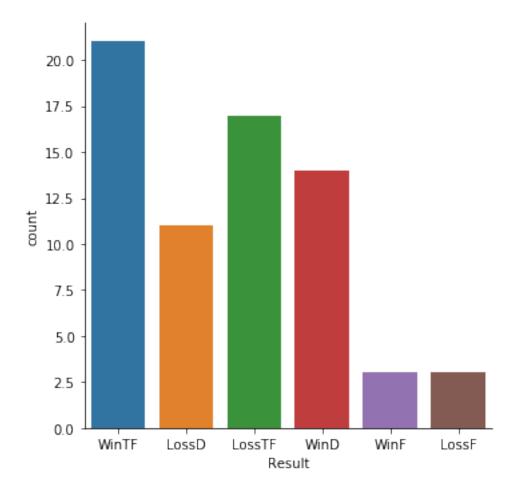


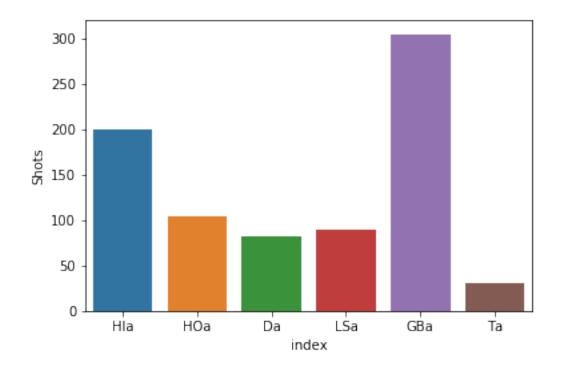
1.2.8 92 kilos 69 matches

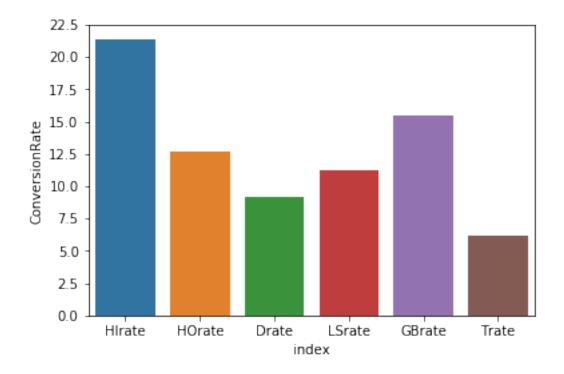
- 1. Daton Fix
- 2. Thomas Gilman
- 3. Zane Richards
- 4. Vitali Arujau
- 5. Darian Cruz
- 6. Nathan Tomasello
- 7. Frank Perrelli
- 8. Zach Sanders

Techs are the most common result followed by Decisions and then Falls as is typical with a Freestyle event.

Distributions of match results.

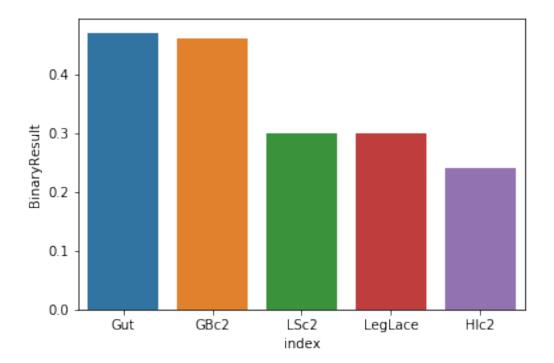






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Top actions for 57kgs at this event.

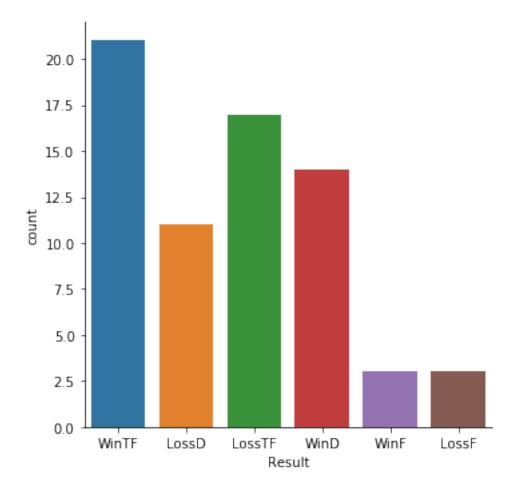


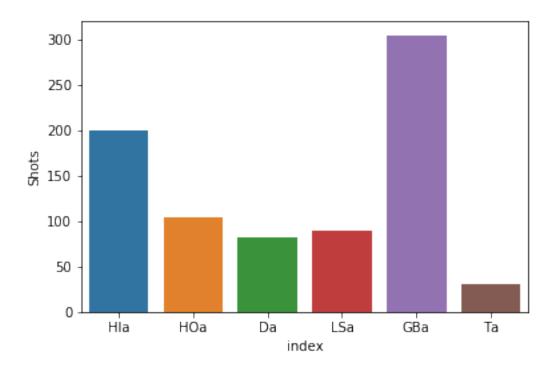
1.2.9 97 kilos 69 matches

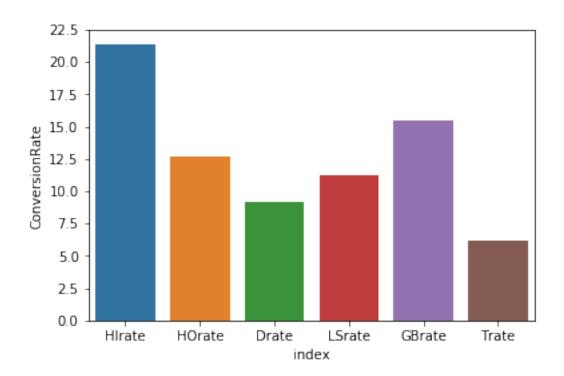
- 1. Daton Fix
- 2. Thomas Gilman
- 3. Zane Richards
- 4. Vitali Arujau
- 5. Darian Cruz
- 6. Nathan Tomasello
- 7. Frank Perrelli
- 8. Zach Sanders

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Distributions of match results.

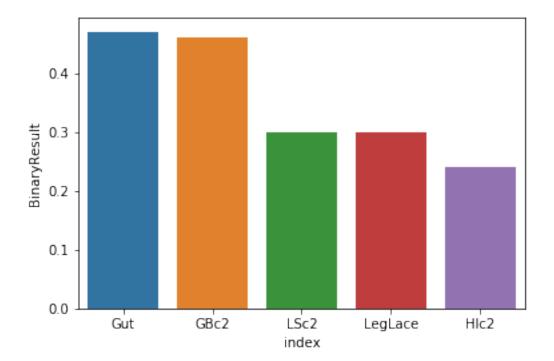






Remember correlations range from -1 to +1 the former representating a strong relationship with a negative outcome (in this case losing the match) and the latter representation a strong relationship with a positive outcome (i.e. winning a match). Correlations closer to 0 represent weak relationships and correlations around 0.5 represent moderate relationships.

Top actions for 57kgs at this event.

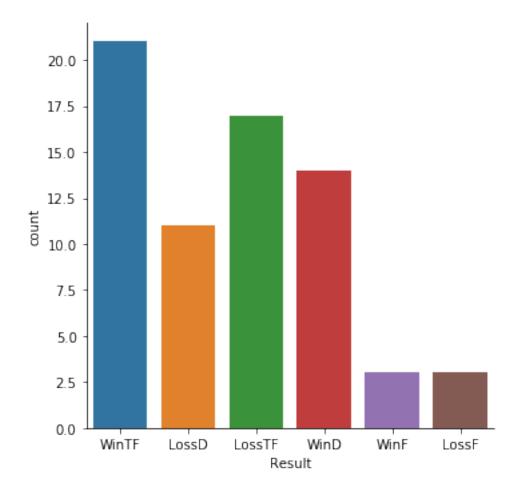


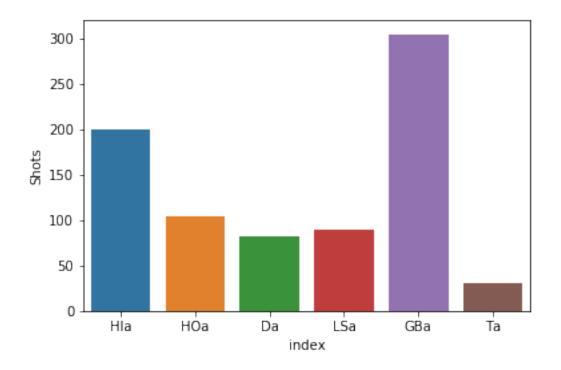
1.2.10 125 kilos 69 matches

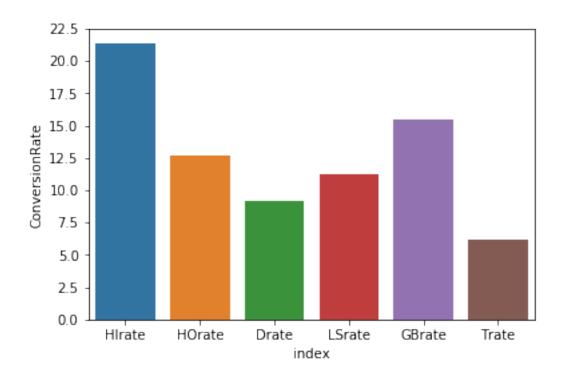
- 1. Daton Fix
- 2. Thomas Gilman
- 3. Zane Richards
- 4. Vitali Arujau
- 5. Darian Cruz
- 6. Nathan Tomasello
- 7. Frank Perrelli
- 8. Zach Sanders

Techs are the most common result followed by Decisions and then Falls as is typical with a Freestyle event.

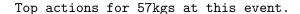
Distributions of match results.

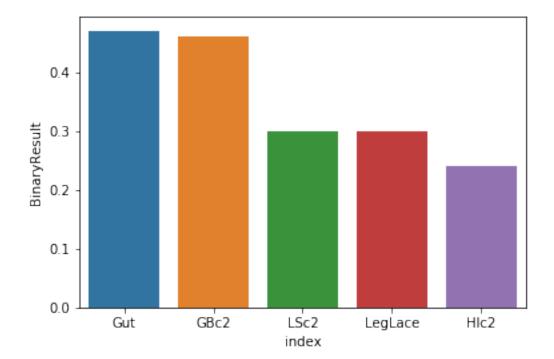






Remember correlations range from -1 to +1 the former representating a strong relationship with a negative outcome (in this case losing the match) and the latter representation a strong relationship with a positive outcome (i.e. winning a match). Correlations closer to 0 represent weak relationships and correlations around 0.5 represent moderate relationships.





1.2.11 Comparison

The comparison between weight classes will focus mostly on Shot Types and Point Distributions as opposed to the result-based distribution above.

Below is a table illustrating different Shot Type conversion rates for the various weight classes. This table can be interpreted multiple ways. For instance, is a low shot conversion rate due to wrestlers at that weight being incapable/inefficient at finishing, or is it a sign that opponents at that weight are excellent defenders of that shot? The following discussion attempts to take both of these perspectives into consideration.

Firstly, it is important to state that top scores for a particular column (or shot type) are highlighted in blue, while bottom scores are highlighted in gold. This table should be read across (left to right), checking the weight class and then identifying its highest/lowest values. Knowing this, we can clearly identify the best/worst weight class for any given shot type. We can see, for

example, that 74kgs has the highest Throw-rate. Interestingly, 125kgs has the highest GBrate... perhaps because of their size.

What may appear less obvious are some trends. For example, that 61kgs is the worst in two categories (LS and GB) as is 79kgs (HO and D and the lowest overall average) but **no** weight is the best in two categories. This showcases the diversity of competing at different weights. 65kgs has the highest overall average, but most scores are in the teens.

Further, some athletes or coaches may find this chart interesting to compare the dynamics of different weight classes in the neutral position. However, these numbers do not represent correlations to success but only raw averages, so bear that in mind.

<pandas.io.formats.style.Styler at 0x7f39704a57d0>

The next table illustrates the various ways to earn points in a match (with the exception of opponent violations) and their highest/lowest values. This table has the same highlighting as the previous one, but should be read vertically (top to bottom) first identifying the weight class of interest then locating its highest/lowest scores.

The scores in this table represent the average points earned per match by each action/technique for each weight class. Similar to the table above this table has multiple possible interpretations. For example, does an action/technique have a low value because it is executed poorly, defended well, or because it is rare and does not occur often?

Guts and GBc2 are clearly popular ways of scoring and account for almost identical (0.83 and 0.82 respectively) points per match. Tc2 is obviously rare as you would expect most Throws to go for 4. The same logic applies to all the leg attacks (HI, HO, D, LS) where it is less common to see a 4-point leg attack finish.

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1.3 Madness Matches

This section focuses on matches with abnormal outcomes. This is sometimes statistically determined (i.e. matches with various metric values outside their third standard deviation values, but sometimes can be determined visually using common sense. inter

1.3.1 Match OEJV (Jesse Vasquez vs Brandon Wright)

This match went the distance as Vasquez and Wright put up 35 combined points.

A back and forth battle, the MoV never exceeded +/- 4 for either wrestler. The deciding factor came when Wright took the lead with a go-behind and 4 succesive leg laces with less than a minute to go. Vasquez managed a takedown and two gut wrenches to come within 1 point but was unable to take the lead in the last 5 seconds.

```
Date
       APM Drate Da
                                  Dc2
                                        Dc4
                                             Duration
                                                       Exposure
     30.0 100.0
1215
                    1
                       2019-04-26
                                     1
                                           0
                                                360.45
                                                               2
              Focus FocusPoints
                                  ... Tc4
                                           Turn Violation
                                                               ٧S
                                                                   Weight
                                        0
                                                             45.9
                                                                       65
1215
     Jesse Vasquez
                              17
                                               0
```

PassiveDiff NumResult BinaryResult BinaryResultText ResultType 1215 0 0.9 0 Loss Decision

[1 rows x 85 columns]

1.3.2 Match QCY3 (Renaldo Rodriguez Spencer vs James Steerman)

You might've missed this match if you blinked... it lasted only 10.37 seconds. Spencer came out strong with a 4-point takedown followed by three succesive gut wrenches to put the match away.

'\n <thead>\n \n

1.3.3 Match WYEF (AJ Jaffe vs Drew Mandell)

Mandell came out strong with an exposure early in the match. However Jaffe stayed calm and slowly gained an increasing lead despite trading points throughout the bout. Eventually he ended it around the 5:30 mark with a WinTF at a whooping 24-13!

All of those points lead to a high APM score of 31 and 46.65 VS for Jaffe after the win. Interestingly this was an even bout on their feet as Jaffe registered only a 1.11 NPF score.

```
APM
                                              Duration
           Drate
                             Date
                                    Dc2
                                         Dc4
                                                         Exposure
                                                                       Focus
                       2019-04-26
     31.0
           100.0
                                                 320.96
                                                                    AJ Jaffe
448
                                      1
     FocusPoints
                  ... Tc4
                            Turn
                                  Violation
                                                  VS
                                                      Weight
                                                              PassiveDiff
448
              24
                         1
                                              46.65
                                                          70
                                                                         0
               BinaryResult BinaryResultText
     NumResult
                                                  ResultType
448
           1.5
                                                         Tech
                            1
                                              Win
```

[1 rows x 85 columns]

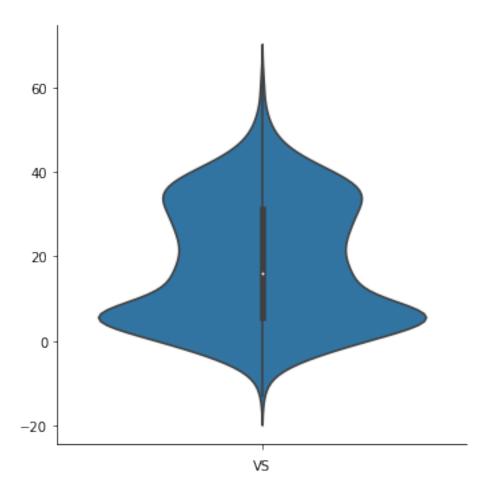
1.4 Veritas Bites

This section emphasizes Veritas Score which accounts for the match result, NPF, and APM and puts all of these KPMs plus over 70 other data points from each match to into a formula that outputs a numeric representation of overall match performance. Veritas Score scales based on the degree of victory.

1.4.1 Overall Event

The event average a VS of 18.3 with a standard deviation of 14.6. Most matches fell between 5.5 - 31.1 VS.

'\n <thead>\n \n



1.4.2 High Value

X4HH had the highest VS (63.5) in a Jason Ness WinTF over Dom Demas.

'\n <thead>\n \n

1.4.3 Low Value

Match 9AOY* had the lowest VS (-13) in a LossTF Donald Mcneil fell to Wynn Michalak.

'\n <thead>\n \n