

The Four Tool Pitching Metric

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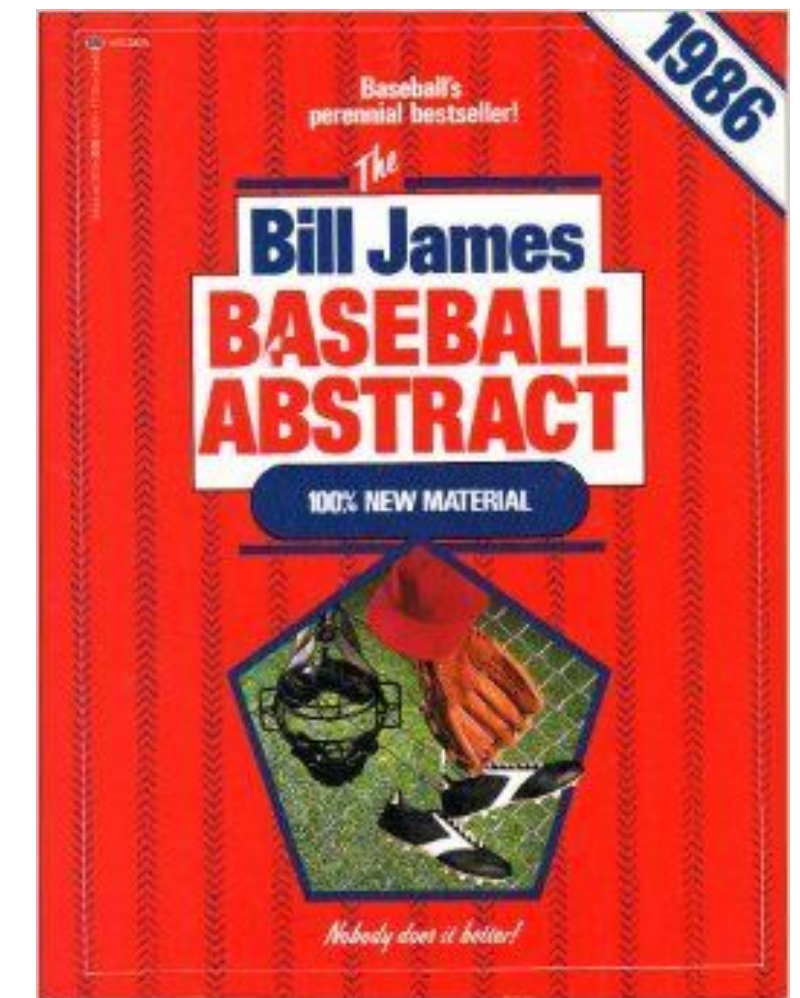
Background

Game Score

- Created by Bill James in 1980's
- Tool for comparing starting pitching performances across time; average = 50
 - Based on simple statistics: outs, strikeouts, walks, hits, and runs allowed

Game Score 2

- Tom Tango (aka Tangotiger) adapted original Game Score in 2019
- Attempting to remove bias for pitchers that face very few batters
- Adds home runs and values walks with equal weight as hits



Game Score vs Game Score 2

The order at the top is unchanged, but v.2 punishes pitchers for not pitching deep into games

Top 10 Game Scores

Pitcher	Date	Game Score v1		Game Score v2	
		Score	Rank	Score	Rank
Justin Verlander	9/1/2019	100	1	106	1
German Marquez	4/14/2019	94	2	101	2
Shane Bieber	7/24/2019	94	2	100	3
Chris Sale	6/5/2019	93	4	100	3
Lucas Giolito	8/21/2019	93	4	100	3
Shane Bieber	5/19/2019	92	6	99	6
Stephen Strasburg	8/31/2019	92	6	98	7
Masahiro Tanaka	6/17/2019	92	6	98	7
Chris Sale	8/8/2019	91	9	97	9
Mike Fiers	5/7/2019	91	9	96	10

Data: Provided to Diamond Dollars Case Competition by Ben Jedlovec and his team at MLB

Bottom 10 Game Scores

Pitcher	Date	Game Score v1		Game Score v2	
		Score	Rank	Score	Rank
Masahiro Tanaka	7/25/2019	-13	4858	-14	4855
Nick Margevicius	6/16/2019	-10	4857	-8	4848
German Marquez	7/15/2019	-9	4856	-8	4848
Edwin Jackson	5/31/2019	-6	4853	-4	4831
Chase Anderson	8/18/2019	-6	4853	-15	4856
Mike Fiers	9/9/2019	-6	4853	-28	4858
Steven Brault	9/13/2019	-3	4852	-24	4857
Kevin Gausman	5/29/2019	-2	4850	3	4790
Pablo Lopez	5/10/2019	-2	4850	-11	4852
Homer Bailey	7/22/2019	-1	4849	-13	4854

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Positives and Negatives of Game Score

Positives:

- Simple
- Comparable across time (no use of modern tools)

Negatives:

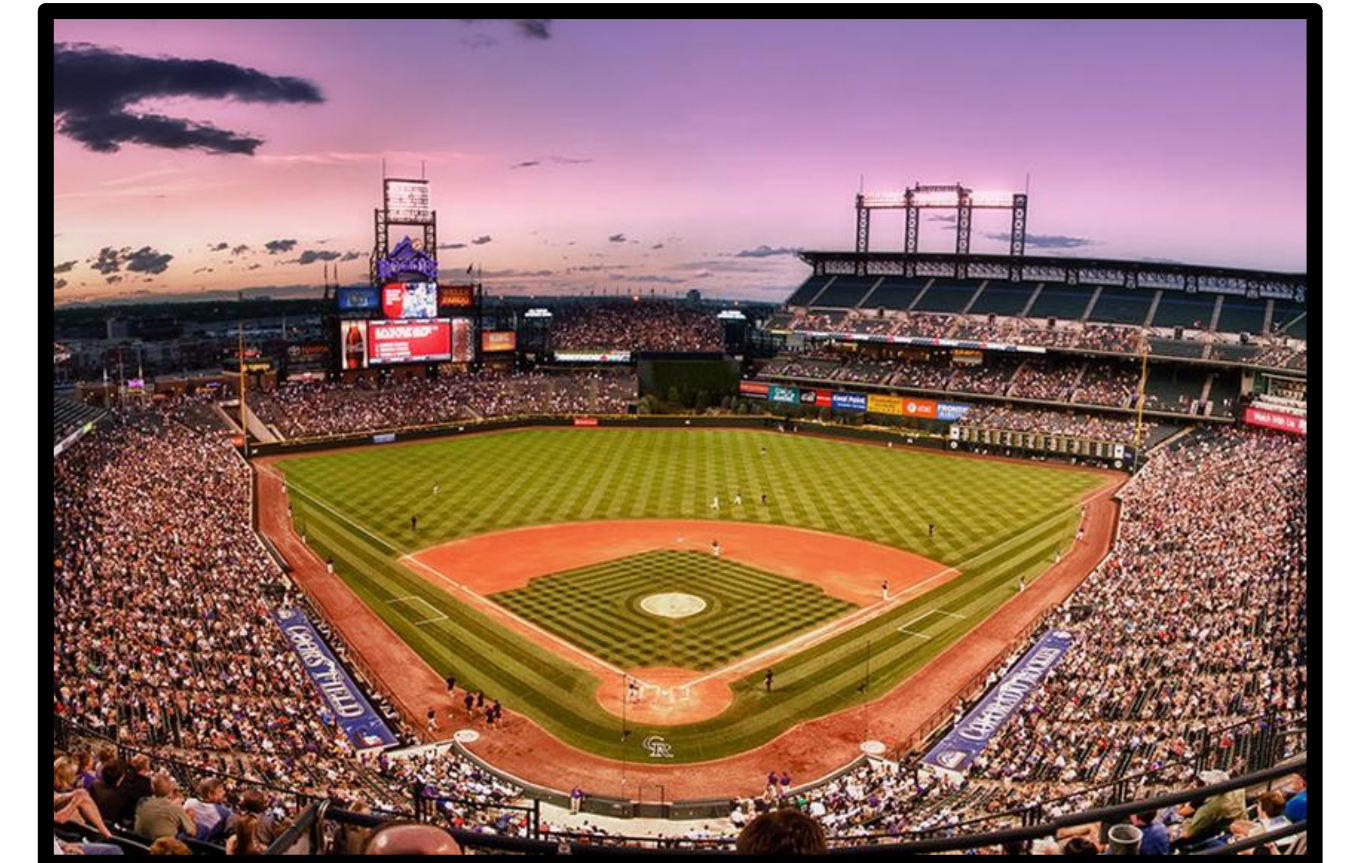
- Outcomes are influenced by factors outside of pitcher's control
- Lacks diagnostic capability



Armando Galarraga's "perfect" game



Fielding Error



Coors Field (elev. 5200 ft.)

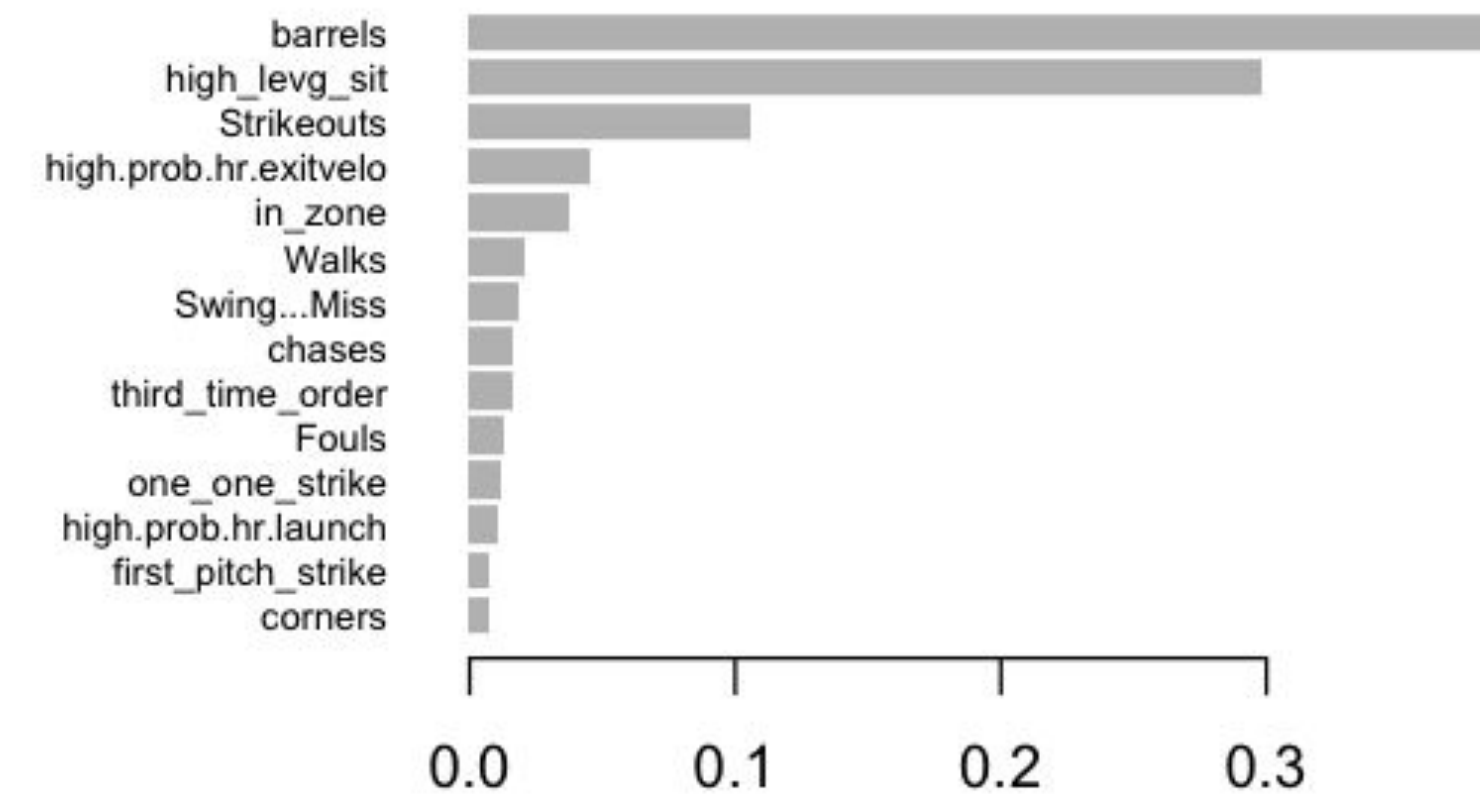
Our Approach



A score that focuses on the Hitter vs. Pitcher matchup and removes outside factors

Statcast data from baseballsavant.com

- Launch Angle
- Exit Velocity
- Barrels
- Pitch locations



Model to determine which stats are most highly predictive of runs

- Run machine learning models (Ridge Regression, Random Forest, xgBoost)
- Determine variable importance

Assign weights to selected variables based on ability to predict game score

The Four Tool Pitching Metric

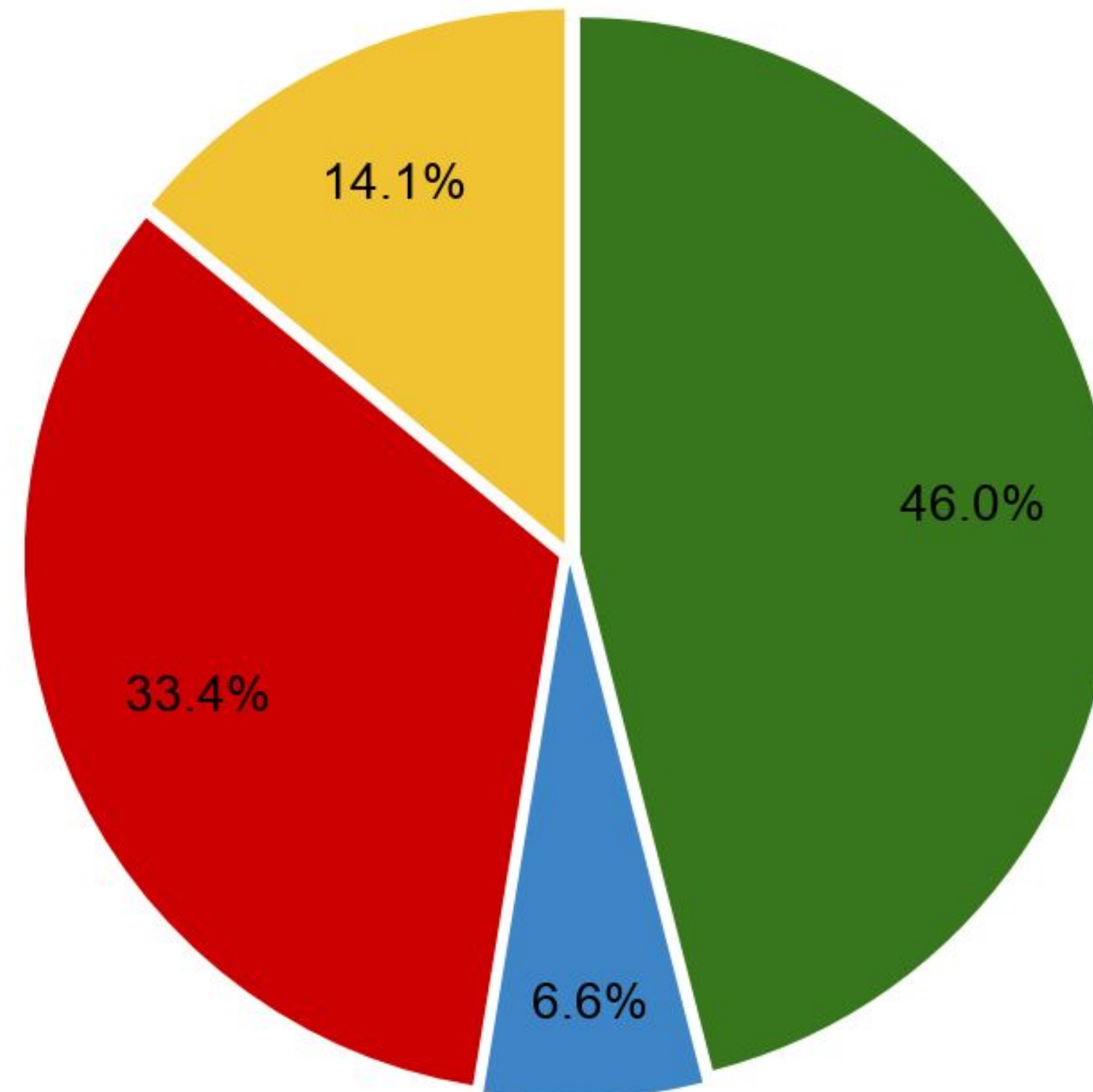
Relative Predictive Value for Earned Runs

The “Stuff”

- Whiffs
- Ks
- Chases

Game Control

- First Pitch Strike
- Strike on 1-1 Count
- Batters Faced > 2 Times
- Batters Faced in High Leverage Situations



Avoiding Hard Contact

- Barrels
- High Exit Velocity
- High Launch
- Fouls

Command

- Walks
- Pitches in the Zone
- Pitches on the Corner

Avoiding hard contact

Barrels

- Launch angle and exit velocity with min. expected BA of .500 and min. expected SLG% of 1.500

High Exit Velocity

- Exit velocity with HR probability >10% (>100 mph)

High Launch

- Launch angle with HR probability >10% (between 22 and 38 degrees)

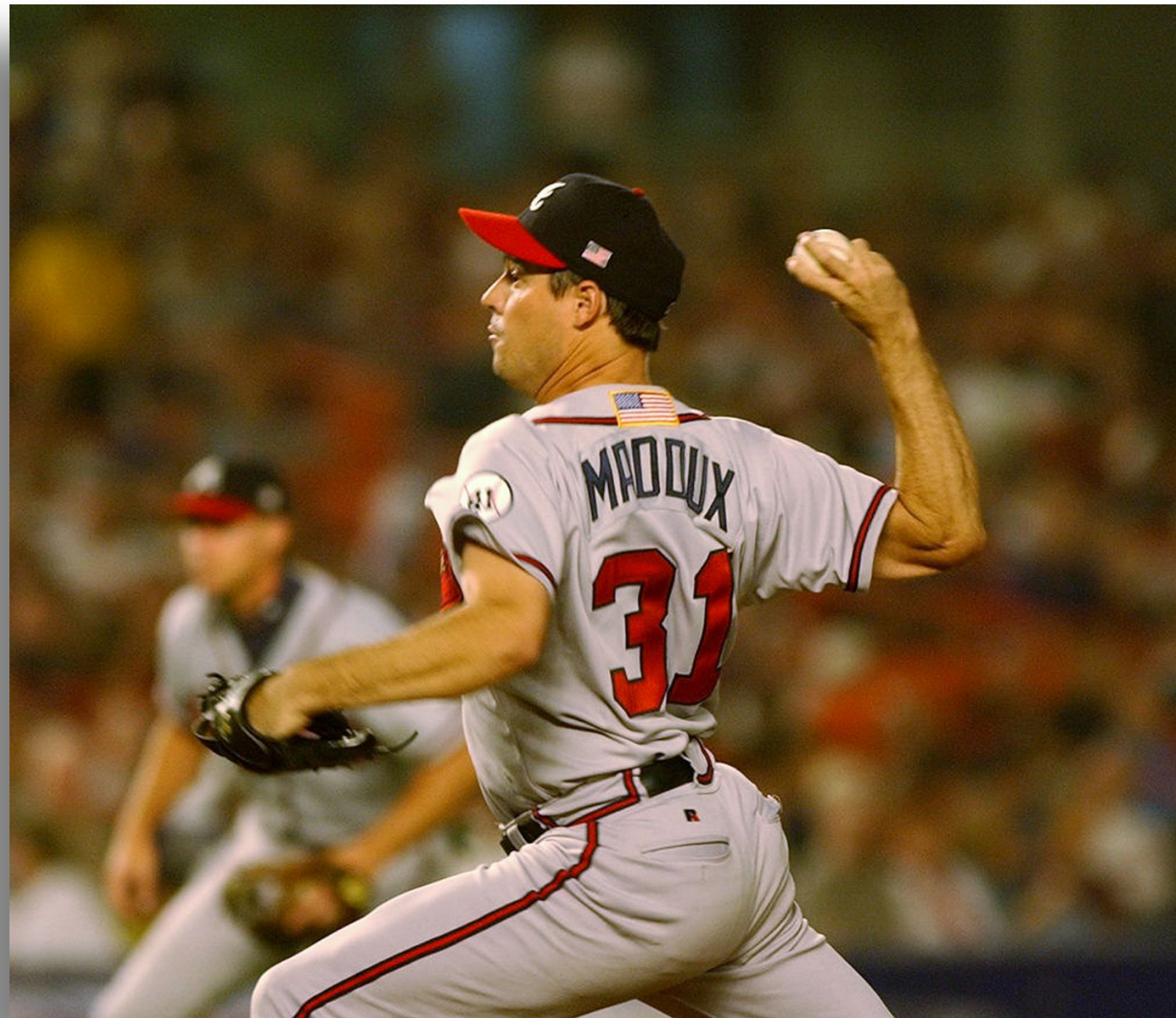
Foul Balls

- Pitcher awarded for causing a foul ball



Avoiding Hard Contact Tool = (-5.6) per barrel + (-1.1) per HEV + (-0.51) per HL + (0.1) per Foul

Command



Walks

- Pitcher penalized for walks

Pitches in the Zone

- Pitches that register in the strike zone according to statcast

Pitches on the Corner

- Pitcher rewarded for pitches on the corner of strike zone

Command Tool = (-2.0) per BB + (0.2) per pitch in zone + (0.1) per pitch on corner

Game Control



First Pitch Strike

- First pitch to a batter results in a strike. Pitcher starts off ahead in count.

Strike on 1-1 Count

- Biggest difference in Batting Avg. by outcome (1-2 or 2-1)

Batters Faced 3 Times

- Indication of successful game control

Batters Faced in High Leverage Situations

- Pitcher penalized for placing himself in a situation with runners in scoring position with less than 2 outs

Game Control Tool = (0.3) per 1st pitch strike + (0.4) 1-1 strike + (1.0) Batters3Times + (-1.9) HLS

The “Stuff”

Whiffs

- When a hitter swings and misses

Ks

- Pitcher awarded for strikeouts

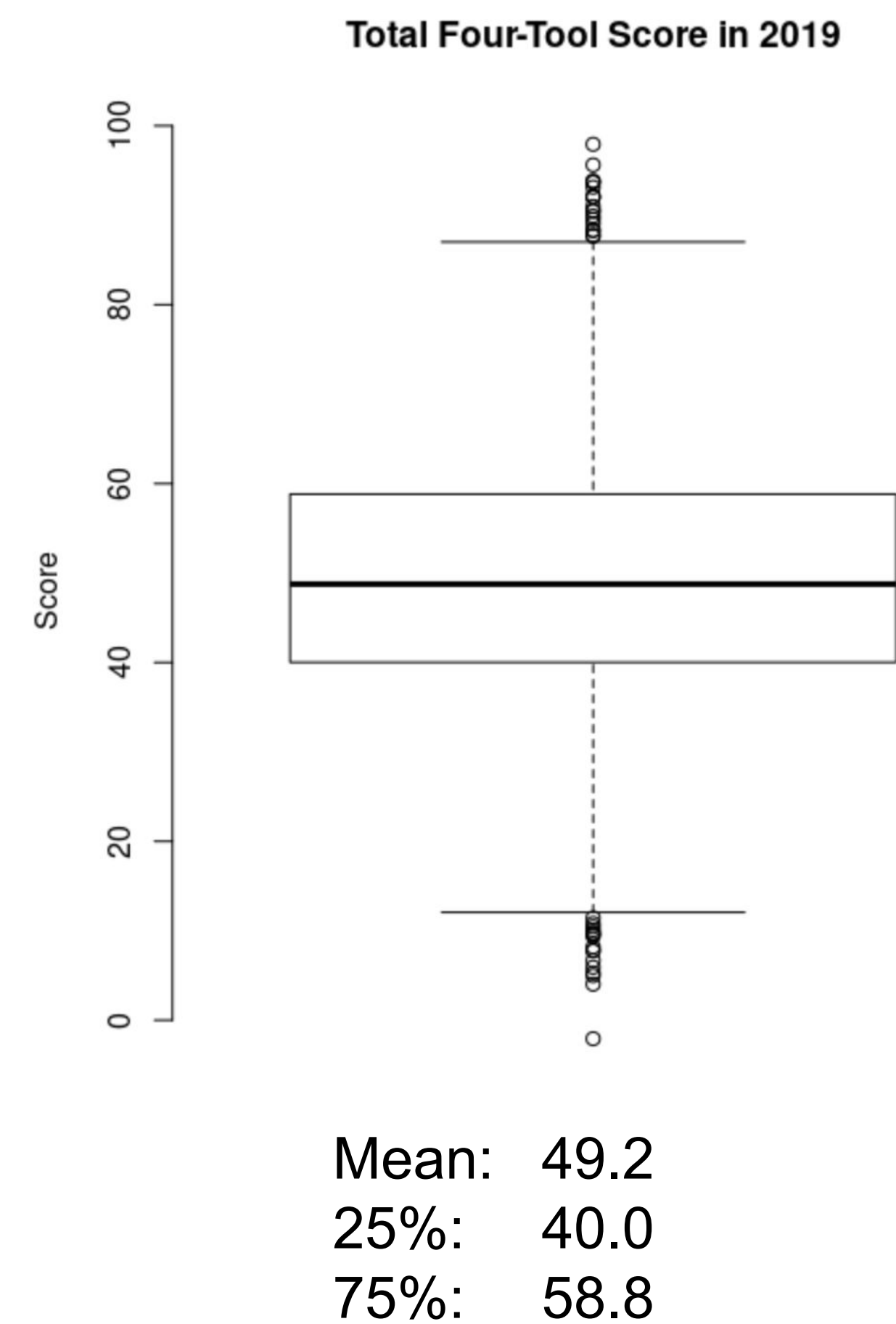
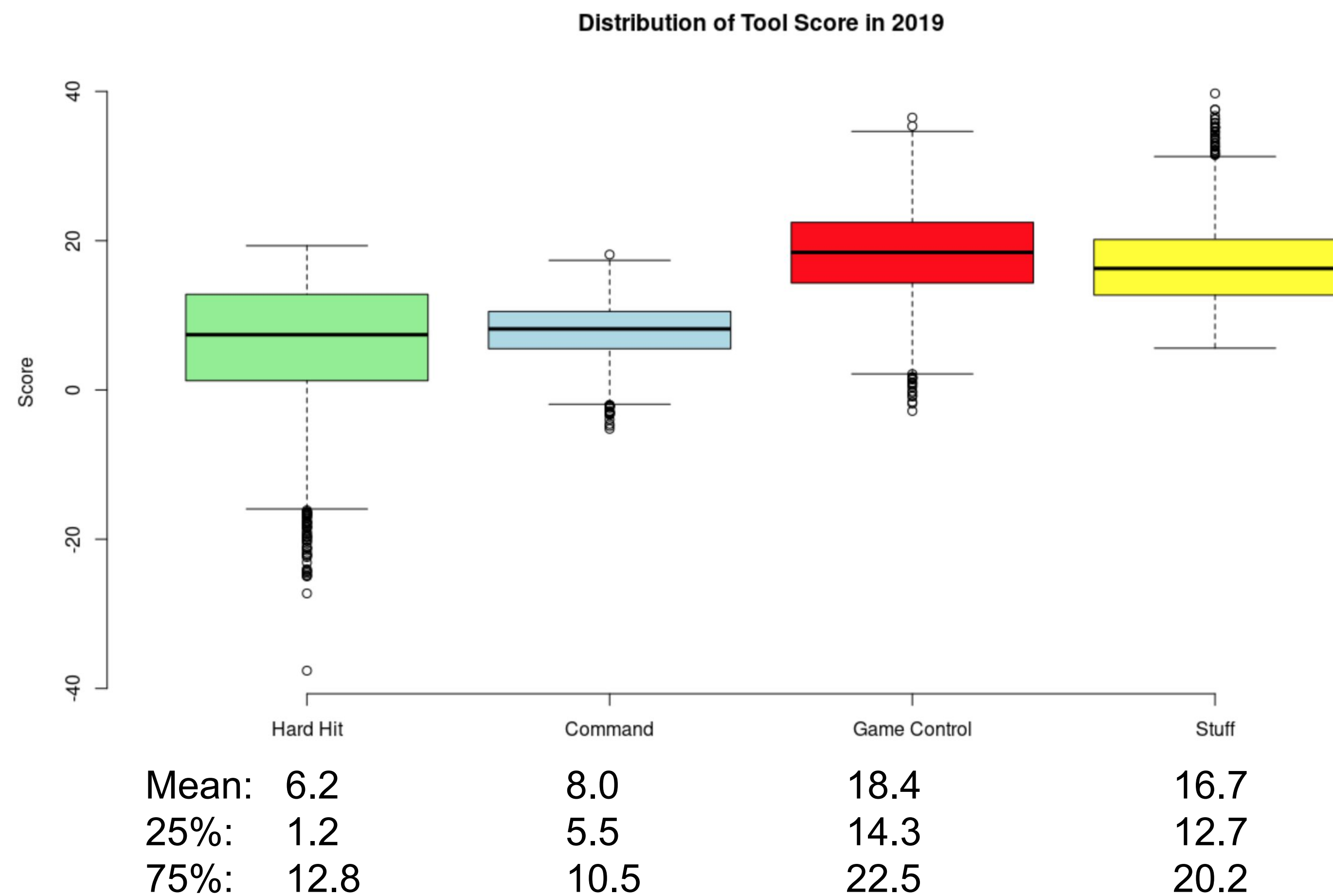
Chases

- Anytime a hitter swings at a pitch outside of the strike zone

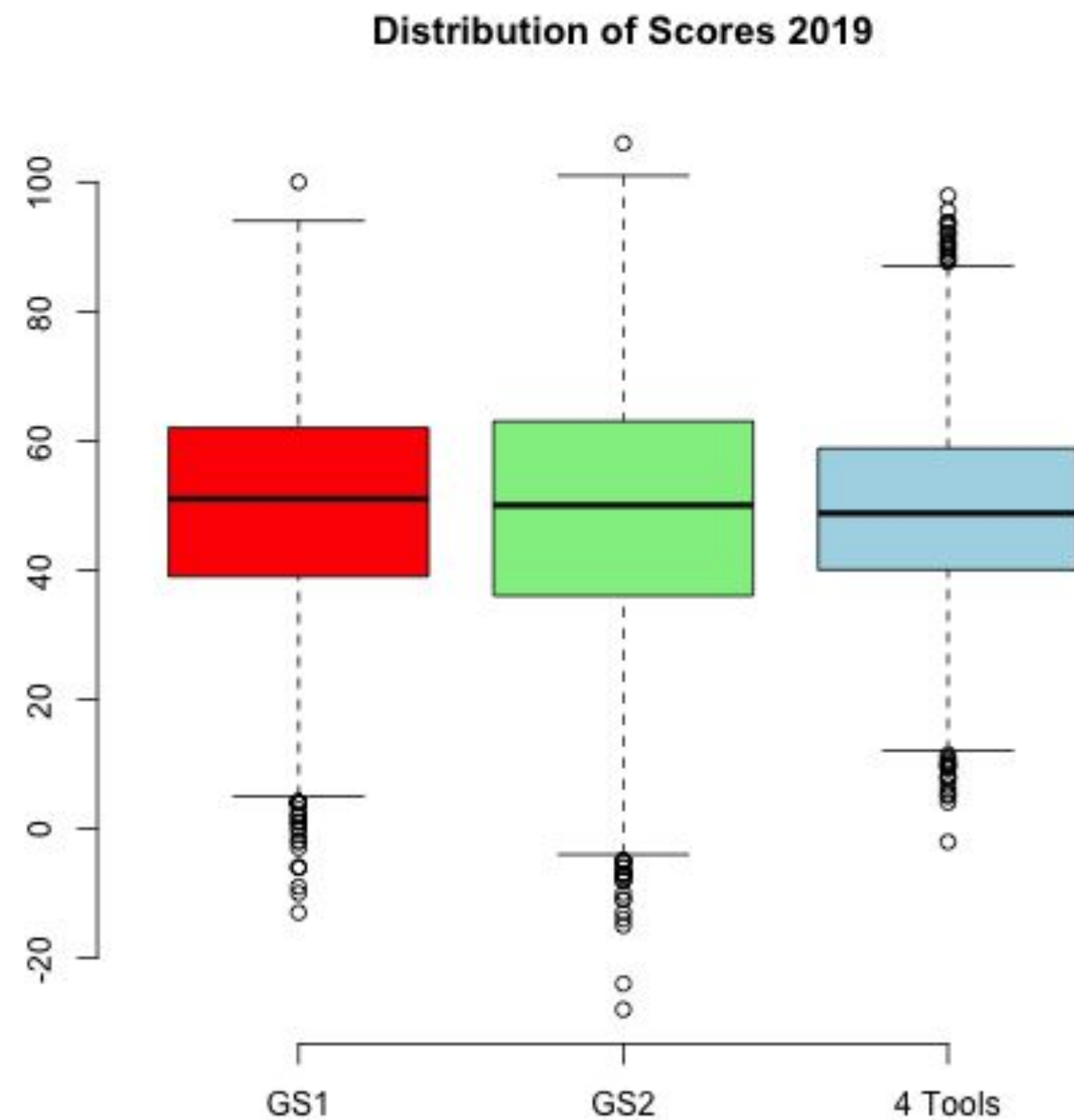


The “Stuff” Tool = (0.2) per whiff + (1.5) per K + (0.19) per chases

Summary of the Four Tool Pitching Metric in 2019



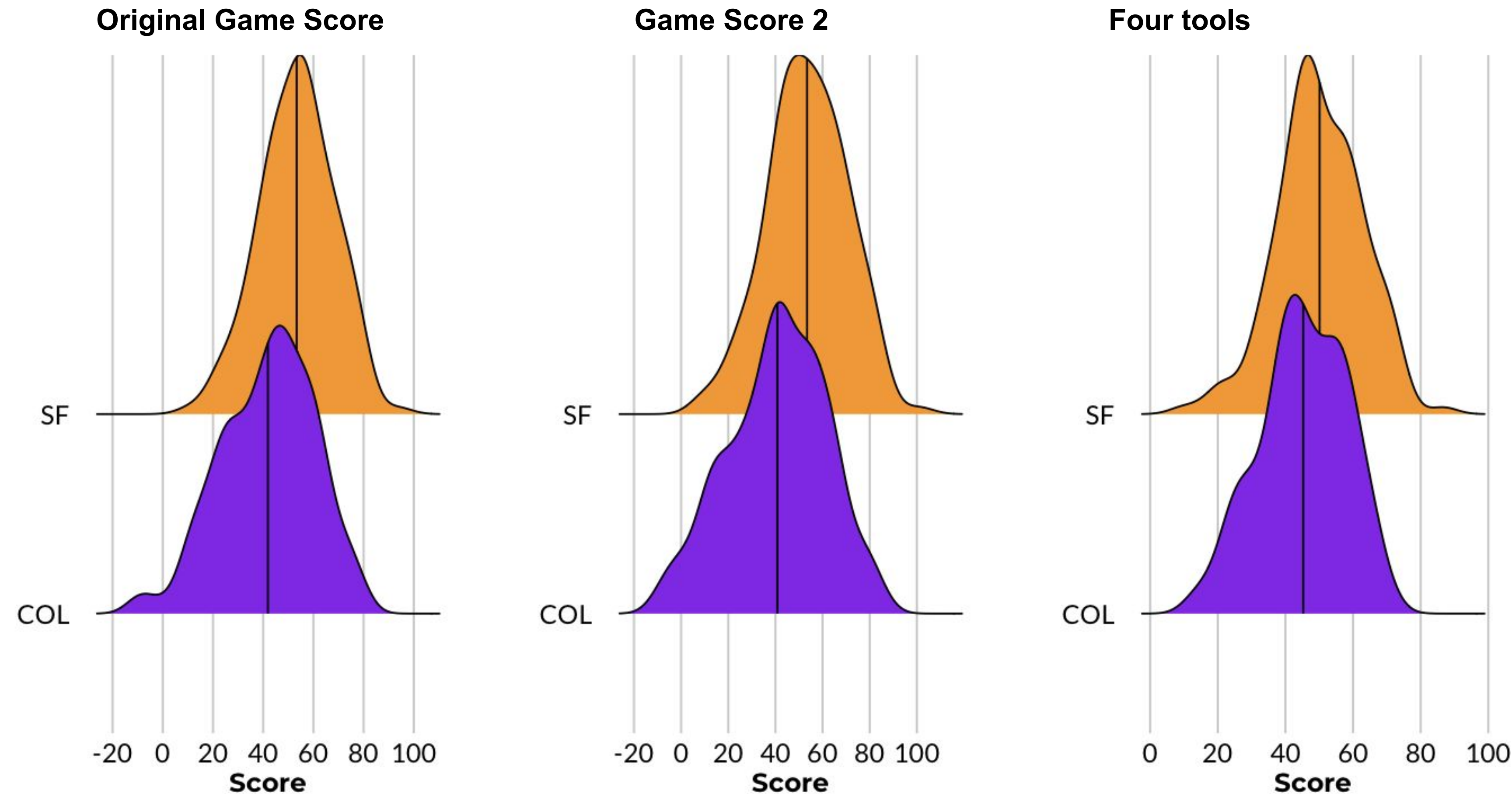
Comparisons to Game Score



Summary:

- The Four Tools sum up to a score that is roughly on the same scale as Game Score
- The distribution of Four Tools scores is tighter around the average
- Four Tools scores are within 0-100 scale, Game Scores 1 and 2 are not

Four Tools reduces bias from Park Factors



- Less variation in distribution between parks
- Shape of distribution nearly identical between SF and COL
- Fewer scores below 20 in COL

Comparisons to Game Score

Top 10 Four Tools Scores

Pitcher	Date	Game Score		Game Score v2		4 Tools	
		Score	Rank	Score	Rank	Score	Rank
Walker Buehler	6/21/2019	89	15	86	71	97.9	1
Chris Sale	5/8/2019	86	31	93	21	95.6	2
Justin Verlander	9/1/2019	100	1	106	1	93.8	3
Andrew Heaney	8/20/2019	84	48	85	87	93.7	4
Gerrit Cole	9/8/2019	91	9	92	27	93.7	5
Max Scherzer	6/30/2019	84	48	85	87	93.1	6
Shane Bieber	5/19/2019	92	6	99	6	92.1	7
Chris Sale	6/5/2019	93	4	100	3	92.0	8
Gerrit Cole	6/7/2019	75	257	73	471	92.0	9
Jacob deGrom	8/23/2019	77	191	82	153	91.0	10

Basic gamelog Provided by Ben Jedlovec and his team at MLB; statcast data from baseballsvant.com

Highlights:

- The top 10 scores for the Four Tools are directionally similar to Game Score
- Justin Verlander's 14K no-hitter moved from 1st to 3rd
- Gerrit Cole's Jun-7 performance is the largest difference, due in large part to 2 unearned runs

Key Takeaway:

The Four Tools scores are different, because it is focused on parts of performance pitchers can control

Case Study 1: Jacob deGrom 8/23/2019

Game Score: 75; Game Score 2: 73; Four Tools: 92

- 13 Ks (8 straight at one point), 1 BB, 1 ER
- 4 hits - all singles
- 3 BBE with an optimal launch angle for homeruns
- 1 BBE with exit velocity over 100 mph
- 0 Barrels

Four Tool Score

- Avoiding Hard Contact: 15.99 (90th percentile)
- Command: 9.94 (69th percentile)
- Game Control: 28.76 (97th percentile)
- The “Stuff”: 36.3 (99th percentile)



deGrom's 4 hits

				
Distance (ft.)	16	3	243	74
Exit Velocity(mph)	102	86	76	87
Launch Angle (deg.)	-7	-32	21	4

Case Study 2: Masahiro Tanaka 6/17/2019

Game Score: 92; Game Score 2: 98; Four Tools: 78

- 10 Ks, 1 BB, 0 ER, 9 IP
- 2 hits - both singles
- 5 BBE with an optimal launch angle for homeruns
- 5 BBE with exit velocity over 100 mph
- 1 Barrel

Four Tool Score

- Avoiding Hard Contact: 5.89 (41st percentile)
- Command: 11.64 (84th percentile)
- Game Control: 32.55 (99th percentile)
- The “Stuff”: 27.67 (97th percentile)



Tanaka's 2 hits



Distance (ft.)	341	278
Exit Velocity(mph)	108	107
Launch Angle (deg.)	20	12

Summary

How to use the Four Tools

- Pitchers and coaches:
 - Filter out the noise from uncontrollable factors
 - Quickly diagnose areas to dig deeper on for further improvement
- Front offices:
 - Quantifiable measure of pitcher effectiveness independent of non-controllable factors
 - Guide further research into which players are overvalued based on “box score” stats

How NOT to use the Four Tools

- To compare players across eras
- As a “holy grail” stat - a starting point for further analysis, not the end-all be-all stat of pitcher performance

Next Steps

App development to bring real-time performance updates to pitching staff and coaches in the dugout and bullpen.

Monitor new innovation. Implementation of Hawk-eye and continued R&D might lead to new stats being added to the Four Tools.

Apply this methodology to relievers, openers, and closers



Questions