An Analysis of Baseball Pitch Data: Quantifying the Effect of Speed, Location and Movement on a Batter's Chances of Getting a Hit

by

Helen Zelman

Submitted to the Department of Mechanical Engineering in Partial Fulfillment of the Requirements for the Degree of

Bachelor of Science

at the

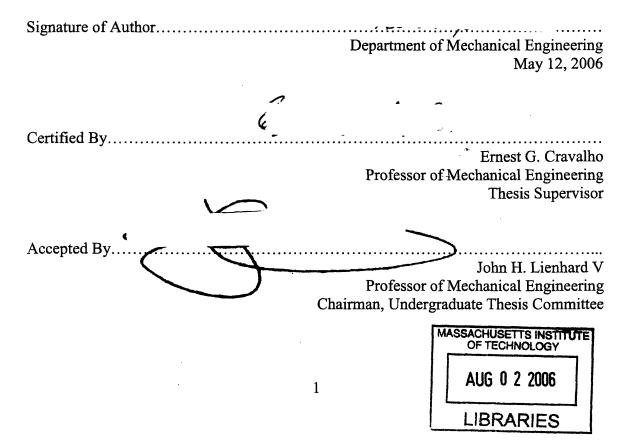
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Abstract

Advances in high-speed camera technology have made it possible to measure the trajectory of a baseball in flight. These trajectories allow for analysis of the characteristics make a pitch difficult to hit. The goal of this paper is to examine the effect of speed, location and movement on hitting statistics such as batting average. The results of this examination support conventional baseball wisdom. Fastballs and pitches in the strike zone are more likely to result in hits than off-speed pitches and pitches outside of the strike zone. Also, additional speed and movement on a pitch decreases the batter's chances of getting a hit. Finally, a preliminary model was created to observe the combined effects of speed, location and movement.

Thesis Supervisor: Ernest G. Cravalho

Title: Professor of Mechanical Engineering

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1. Introduction

"Hitting is timing. Pitching is upsetting timing" – Warren Spahn

Warren Spahn certainly knew a lot about upsetting hitters' timing. In 21 Major League seasons, Spahn won 363 games, the most ever by a left-hander. He was named to the National League All-Star team 14 times. In 1957, he led the Milwaukee Braves to a World Championship while winning the Cy Young Award. In 1965, his number #21 was retired by the Braves organization. Spahn's variety of pitches in his arsenal was almost as extensive as his Hall of Fame credentials. When he came up with the Boston Braves in 1942, he featured a fastball, curveball, changeup and sinker. Later on in his career, as his fastball started to fade, he added a screwball, a slider and even a knuckleball.

While each Major League pitcher throws a different combination of pitches, all pitchers have the same goal of upsetting hitters timing. To do this they vary the speed, movement and location of each pitch. With currently available high-speed camera technology, it is possible to measure the trajectory of a baseball in flight. Pitch tracking systems have already been used to evaluate umpires abilities to call balls and strikes, but this same data can be used to analyze the effectiveness of a pitch. By looking at the speed, movement and location of the nearly 50,000 pitches thrown during the 2004 and 2005 seasons at Fenway Park, we can begin to discover what makes some pitches nearly unhittable, while others land on the other side of the Green Monster.

1.1 Data Acquisition

The data used in this thesis has come from Questec's Umpire Information System at Fenway Park during the 2004 and 2005 baseball seasons. "The UIS uses QuesTec's proprietary measurement technology that analyzes video from cameras mounted in the rafters of each ballpark to precisely locate the ball throughout the pitch corridor."¹ The system uses two cameras in the rafters to triangulate the 3-dimensional trajectory, and

¹ Questec, http://www.questec.com

two cameras in the dugouts to reference the top and bottom of the strike zone. Table 1.1 below describes the data made available for this analysis.

Variable	Example
BallCount	2
StrikeCount	1
PitchNumber	56
BatterID	Batter X
Batter Hand	R
PitcherID	Pitcher A
Inning	3
PitchResult	Called Strike
EntryX (in)	-7.4
EntryY (in)	37.4
ExitX (in)	-7.2
ExitY (in)	34.8
Top (in)	38.3
Bot (in)	18.6
PitchSpeed (mph)	64.3

Table 1.1: Data for an Example Pitch

In the example from the table, the 56th pitch of the game was thrown by Pitcher A to Batter X (a right-handed batter) on a 2-1 count. The result of this pitch was a called strike. Entry X and Exit X refer to the horizontal point at which the pitch entered and exited the strike zone. A value of zero would indicate that the pitch was located in the center of the plate. From the pitcher's view, negative values indicate that the pitch is to the right of the center and positive values indicate that the pitch is to the left of center. Entry Y and Exit Y refer to the vertical point at which the pitch entered and exited the strike zone. This distance indicates the height of the pitch from the ground. The top and bottom of the strike zone are uniquely calculated for each batter and also indicate distance from the ground. Finally, pitch speed is recorded in miles-per-hour.

2. Pitch Speed

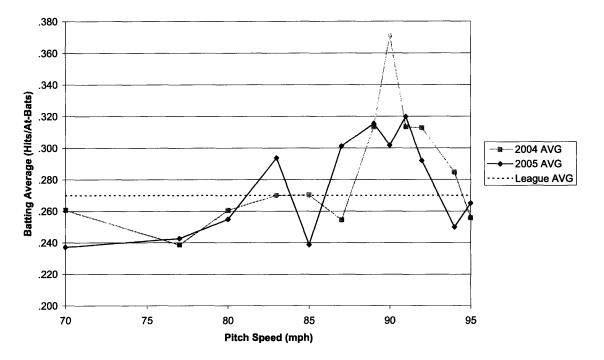
"One of the best fastballs I'd ever thrown was hit for a home run [by the Braves' Joe Torre]. I learned the hard way that it would be impossible to get by in the major leagues with just a fastball, no matter how hard it was thrown" -- Nolan Ryan

With all other factors being equal (movement and location), additional speed on a fastball most likely decreases the batter's ability to get a hit. Regardless of a pitcher's intentions, increasing the speed of a pitch decreases the time a batter has to react. However, pitchers should not take the mound with the mentality to throw the ball as hard as they can. Increasing speed generally leads to less movement and decreases the pitcher's ability to control the location of the pitch. While speed often comes at the sacrifice of other desirable features of a pitch, it is not necessarily desirable for all types of pitches.

Consider the change-up. Pitchers often describe a change-up as a difficult pitch to learn. A pitcher who throws a good change-up tries to use the exact same pitching motion as he does to throw a fastball. This will upset a hitter's timing and will generally cause him to swing to early. What makes this pitch successful is the difference in speed from the pitcher's fastball. For example, a pitcher who throws a 94 mph fastball might try to throw a change-up that is 82 mph. If his change-up was only a few miles-per-hour slower than his fastball, he will probably find this to be a very ineffective pitch. Therefore, speed is not necessarily desired on all types of pitches.

2.1 The Effect of Pitch Speed on Batting Average

The first study done to measure the effect of pitch speed on hitting ability included all pitches from each of the 2004 and 2005 seasons. Pitch speed was binned into 12 intervals of 2000 pitches. Only pitches that resulted in at-bats (hits or outs) were used to calculate batting average. The results of this study are shown in figure 2.1 below.



Batting Average Versus Pitch Speed

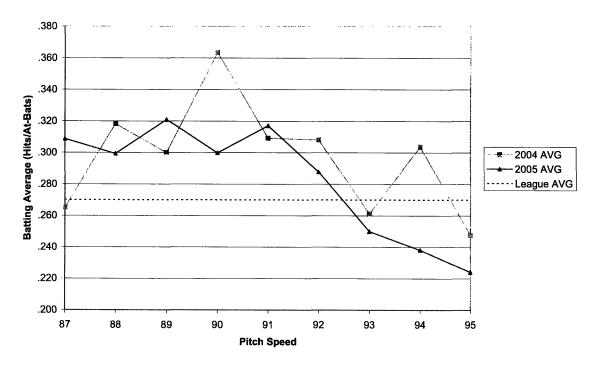
Figure 2.1: Batting Averages Versus Pitch Speed for All Pitches

While this graph does not show a relationship between batting average and pitch speed over the full range of pitches, it does provide interesting results. At speeds at and below 85 mph, batting averages tend to be significantly below league average, but at speeds above 85 mph, batting averages tend to be above league average. In fact, at speeds within a few mph of 90, batters remarkably hit over .300. This implies that fastballs are simply easier to hit than off-speed pitches. However, batting average appears to peak at 90 mph and decrease at speeds above this threshold. This may imply that batting ability decreases with additional speed on fastballs.

2.2 The Effect of Pitch Speed on Batting Average (Pitches Over 87 mph)

The first attempt to distinguish fastballs from other types of pitches involved declaring 87 mph to be an arbitrary cut-off. This is not the ideal method, because some fastballs only reach the low-to-mid 80s and some off-speed pitches begin to creep up to

the low 90s. Pitch speed was binned in 1 mph intervals and was capped at 95 mph because there weren't a significant number of at-bats above that speed. Only pitches that resulted in at-bats (hits or outs) were used to calculate batting average. The results of this study are shown in figure 2.2 below.



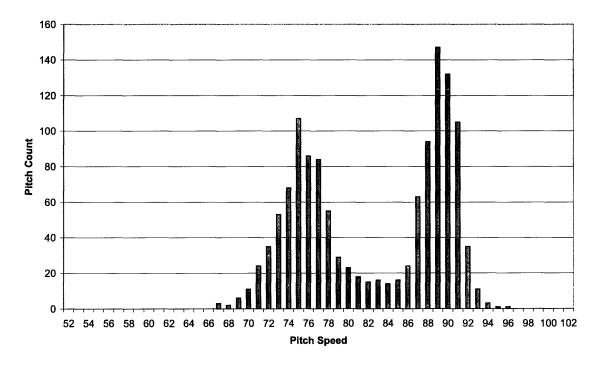
Batting Average Versus Pitch Speed

Figure 2.2: Batting Average Versus Pitch Speed for Pitches Over 87 mph

The results from the above graph are mixed. The data from 2004 appeared to show very little correlation ($R^2 = 0.1022$) between batting average and pitch speed. However, the data from 2005 showed a strong correlation ($R^2 = 0.731$). The 2005 model predicted that 1 extra mph on the fastball decreased batting average by roughly 11 points. The discrepancies are most likely due to sample size, because there were a different number of at-bats for each speed. Interestingly, the peak batting average at 90 mph in 2005 occurred at the most frequently observed speed. Perhaps, hitters had timed the 90 mph fastball well because that is the speed that they were most used to hitting.

2.3 The Effect of Pitch Speed on Fastballs and Non-Fastballs

A better model for distinguishing fastballs from other types of pitches would take in to account individual pitchers. For a specific pitcher, a pitch speed distribution can be generated. This bar graph will show how often a pitcher throws at a specific speed. From these graphs, you can begin to get an idea of the different types of pitches a particular pitcher throws. Consider the 1281 pitches observed from Pitcher A in 2004:



Pitcher A's 2004 Pitch Speed Distribution

Figure 2.3: Bar Graph Displaying the Number of Pitches Thrown at Each Speed by Pitcher A

According to his scouting report on ESPN.com, Pitcher A throws four different pitches. He throws a 2-seam and 4-seam fastball that goes from 88-89 mph and up to 92 mph at times. His change-up has been clocked at 76-79 mph and his curve is generally in the 73-78 mph range.² The graph above tends to agree with the scouting report. The graph also shows that the lower limit to Pitcher A's fastball is at about 86 mph. By repeating this process for each pitcher, a better model is developed to distinguish fastballs from off-speed pitches.

For every pitcher that pitched at Fenway Park in 2004, a pitch speed distribution graph was generated to determine the lower limit of each pitcher's fastball. This new definition was used to distinguish between fastballs and non-fastballs. Pitches were again binned into 1 mph intervals and batting averages were calculated for pitch speeds with at least 100 at-bats.

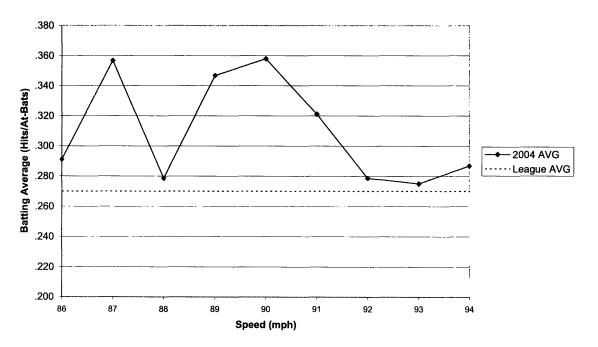
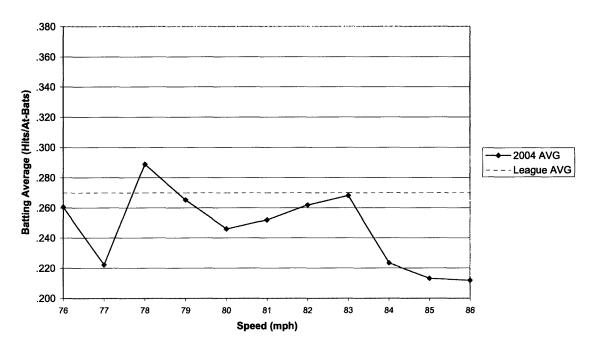




Figure 2.4: Batting Average Versus Pitch Speed for Pitches Determined to be Fastballs

² ESPN.com scouting report for Pitcher A, http://insider.espn.go.com/mlb/players/insider?playerId=XXXX

This model produces only slightly better results than the previous one that used an arbitrary lower limit for the fastball. This time the correlation ($R^2 = 0.1373$) was still weak and indicated that an additional 1 mph decreased batting average by 5 points. At each fastball speed, the batting average calculated was above league averages. The same analysis was repeated for pitches that did not qualify as fastballs.



Batting Average Versus Pitch Speed (Non-Fastballs)

Figure 2.5: Batting Average Versus Pitch Speed for Pitches Determined Not to be Fastballs

For non-fastballs, there is a better correlation ($R^2 = 0.288$) between batting average and pitch speed. It appears as if additional speed is a desirable feature when comparing an off-speed pitch to other off-speed pitches. Here, an additional 1 mph on a non-fastball equates to a decrease in 4 points in batting average. More important though, is the fact that all but one of the batting averages calculated for non-fastballs were below league average.

A simple comparison between fastballs and non-fastballs yields interesting results.

Fastballs Compared To Non-Fastballs								
	Н	AB	AVG	SLG	HR	K		
Fastballs	947	3063	.309	.555	113	498		
Non-Fastballs	612	2468	.248	.415	68	643		

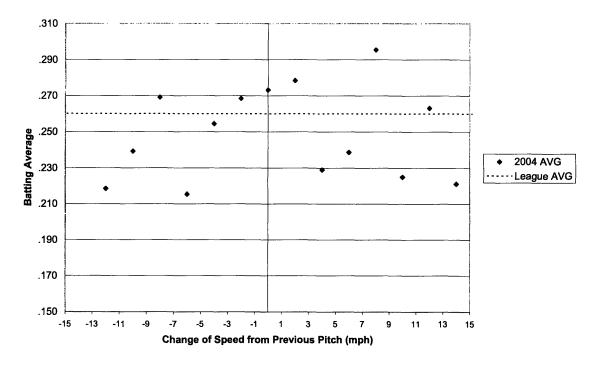
Table 2.1: Batting Statistics for Fastballs and Non-Fastballs

In 2004, fastballs resulted in 3063 at-bat outcomes and non-fastballs resulted in 2468 at-bat outcomes. Fastballs resulted in a significantly higher batting average as well as slugging percentage. Almost twice as many homeruns were hit off fastballs as compared to non-fastballs and fastballs resulted in nearly 25% fewer strikeouts. Considering this statistics, it is possible to conclude that fastballs are a lot easier to hit than off-speed pitches.

2.4 The Effect of Change of Speed on Batting Average

A simple study was done to measure the effect that changing speed from the previous pitch had on the outcome of a pitch. All pitches from 2005, excluding the first pitch of each at-bat were considered. On average, batters hit .260 on pitches that did not end on the first pitch of the at-bat. Batting average was then calculated for each change of speed at 2 mph intervals. A change of speed of zero would indicate that the pitch was thrown at the same speed as the previous pitch. A positive value of change of speed would indicate that the pitch was thrown faster than the previous pitch, while a negative value of change of speed would indicate that the pitch was thrown slower than the

previous. For example, an 88-mph fastball thrown after a 76-mph curveball would result in a +12 mph change of speed. The results of this study are shown in figure 2.6.



Batting Average Versus Change of Speed

Figure 2.6: Batting Average Versus Change of Speed from Previous Pitch

As the magnitude of change of speed increases, batting averages decrease. This relationship is stronger when the pitch is slower than the previous pitch than when the pitch is faster than the previous pitch, but holds true in both directions. In particular, hitters struggled when the magnitude of change of speed from the previous pitch was greater than 10 mph. This is most likely the result of upsetting hitters' timing.

3. Location

"In pitching, as in real estate, there's a simple mantra: Location, location, location, " – Johnny Bench

According to Johnny Bench, location is the single most important attribute of a pitch. Most pitchers and catchers would agree with Bench's statement. In general, pitchers try to throw strikes that pass through the strike zone as little as possible. This usually means aiming for the corners of the strike zone. As defined by Major League Baseball's Official Rules, the Strike Zone "is that area over home plate the upper limit of which is a horizontal line at the midpoint between the top of the shoulders and the top of the uniform pants, and the lower level is a line at the hollow beneath the knee cap. The Strike Zone shall be determined from the batter's stance as the batter is prepared to swing at a pitched ball."³ This definition is accompanied by the figure below.

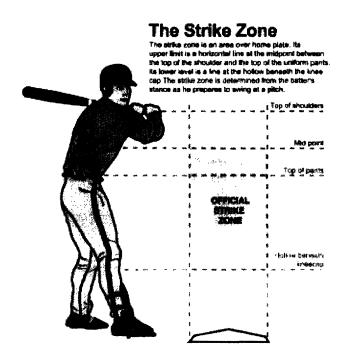


Figure 3.1: The Strike Zone as Defined by Official MLB Rules

³ Official Baseball Rules,

http://mlb.mlb.com/NASApp/mlb/mlb/official info/official rules/definition terms 2.jsp

Commonly accepted pitching theories attribute success to pitchers who can locate their pitches down in the strike zone and can use both corners of the plate. Pitches thrown right down the center of the plate often result in hits or even homeruns. Similarly, pitches that are up and over the plate allow the hitter to extend his arms fully to reach his maximum power stroke. With currently available pitch tracking technologies, it is possible to accurately record pitch locations within 1/2". This allows the conventional wisdom regarding pitching location to be objectively analyzed.

3.1 Breaking Down the Strike Zone

Breaking down the Strike Zone is a simple task. For this study, the Strike Zone was broken down into 16 sections. The data from both 2004 and 2005 were combined so that there would be a more significant number of at-bats for each section. The batting averages were calculated separately for left-handed batters and right-handed batters. The figures below represent the Strike Zone from the view of the pitcher.

.250	.284	.326	.311
.238	.321	.340	.391
.268	.332	.357	.299
.211	.398	.326	.298



AVG	- RHB
-----	-------

.302	.353	.267	.321
.282	.369	.371	.337
.278	.308	.348	.321
.262	.279	.369	.296

Figure 3.2: Batting Averages Calculated for Each Section of the Strike Zone

It is clear from these diagrams that locating a pitch in the middle of the strike zone is very dangerous for a pitcher. Both left-handed batters and right-handed batters hit at least .300 on pitches in the middle four sections of the Strike Zone. More directly, lefthanded batters hit .340 in the middle four sections and .311 in the rest of the zone while right-handed batters hit .348 in the middle four sections and .302 in the rest of the zone.

A similar study can be done to observe the effect of location on slugging percentage. This will give a better representation of hitting ability for extra bases in different areas of the Strike Zone. The Strike Zone is broken up into the same 16 sections as above.

.426 .592 .608	.467
.443 .532 .589	.572
.631 .549 .550	.494
.368 .624 .509	.409



.479	.623	.490	.579				
.482	.574	.717	.647				
.404	.506	.674	.625				
.369	.408	.661	.583				



Figure 3.3: Slugging Percentages Calculated for Each Section of the Strike Zone

The analysis of slugging percentage in different sections of the Strike Zone produces similar results to that of batting average. For both left-handed and right-handed hitters, slugging percentage is over .500 in the middle four sections of the zone. In fact, for left-handed hitters slugging percentage is .557 in the middle four sections and .518 in the rest of the zone. For right-handed hitters, slugging percentage is .616 in the middle 4 sections and .512 in the rest of the plate. These data show that pitchers should avoid throwing pitches over the middle of the plate.

3.2 Comparing Strikes and Balls

Based on the official definition of the Strike Zone, all of the pitches in the 2005 data set were determined to be balls or strikes. This analysis was done in order to be completely umpire-independent. Regardless of the umpire's call or whether or not the

batter made contact, all pitchers were categorized by their location. Batting average and slugging percentage were calculated for pitches in the Strike Zone and pitches out of the Strike Zone. Homeruns and strikeouts were counted as well.

Strikes Compared to Balls								
	н	AB	AVG	SLG	HR	K		
Strikes	1158	3672	.315	.531	141	416		
Balls	389	1856	.210	.304	27	595		

Table 3.1: Batting Statistics for Strikes and Balls

Clearly, the Strike Zone exists for a reason. Batters have extreme difficulties hitting pitches out of the zone. The batting average for balls is 105 points lower than the batting average for strikes. Likewise, the slugging percentage for balls is 227 points lower than the slugging percentage for strikes. Less than $1/6^{th}$ of homeruns are hit on balls. Finally, more strikeouts occur when pitchers fool batters in to swinging at pitches outside of the Strike Zone.

4. Movement

"I was taught that movement is more important than velocity. That advice came from somebody I trusted. I still believe that today" -- Greg Maddux

Not known for throwing very hard, Greg Maddux has put together a spectacular career by relying on the movement of his fastball. Movement is the most difficult variable of a pitch to calculate. Without knowing the full trajectory of the pitch or the spin of the ball in flight, it is impossible to figure out the entire horizontal and vertical break. For this analysis, only the entry point and exit point of the Strike Zone are used. Horizontal movement will be defined as the net horizontal displacement as the ball passes through the zone and vertical movement defined as the net vertical displacement as the ball passes through the zone. The following equations illustrate these definitions.

$$X_{movement} = X_{exit} - X_{entry}$$
(1)
$$Y_{movement} = Y_{exit} - Y_{entry}$$
(2)

It is fair to expect most pitches to break several inches as the ball approaches the plate. It is important to reiterate that for this investigation, the movement is only being calculated over the distance from the front end to the back end of the plate. This causes the movement to be on the order of one to two inches. It is assumed that this is a reasonable estimation with respect to the entire flight of a pitch.

4.1 Comparing Movement and Speed

To gain a better understanding of pitch movement, psuedocolor plots were generated to display movement with respect to pitch speed. The data set chosen was all of the pitches thrown by Pitcher A in 2004. These plots appear to present a better description of pitch type as opposed to the pitch speed distribution graphs.

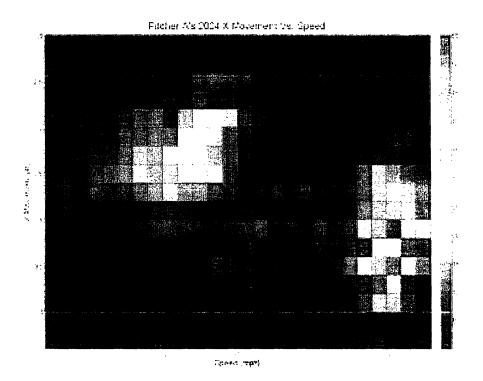


Figure 4.1: Pseudocolor Plot Showing the Horizontal Movement and Speed of Pitcher A's Pitches in 2004

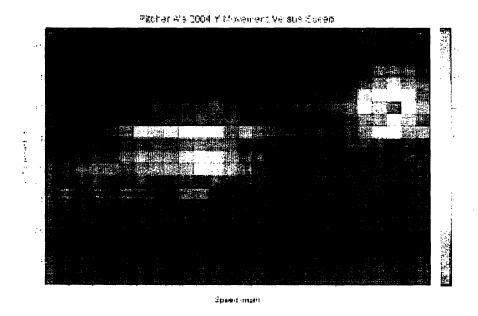


Figure 4.2: Pseudocolor Plot Showing the Vertical Movement and Speed of Pitcher A's Pitches in 2004

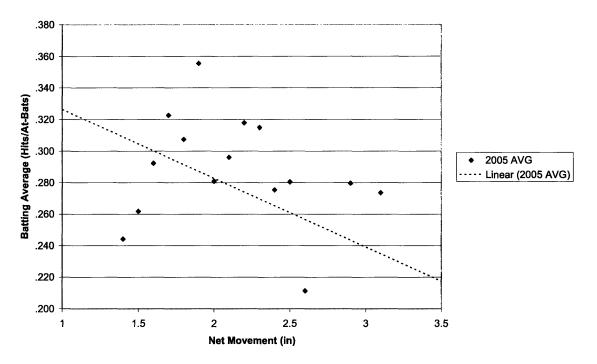
As expected, pitches at lower speeds tend to have more movement in both directions than pitches at higher speeds. These plots clearly differentiate Pitcher A's fastball from his off-speed pitches. The variance in each of the clusters lends to the probability that Pitcher A has multiple types of fastballs and multiple off-speed pitches at his disposal. This would support the scouting report as mentioned earlier.

4.2 The Effect of Net Movement on Batting Average

In order to observe the effect of movement on batting ability, horizontal movement and vertical movement were combined into one variable. This new variable, net movement, is calculated by the following equation:

$$Net_{movement} = \sqrt{X_{movement}^{2} + Y_{movement}^{2}}$$
 (3)

This study included all pitches from the 2005 season that resulted in at-bat outcomes. Net movement was rounded to the nearest tenth inch and batting average was calculated for intervals with at least 100 at-bats.



Batting Average Vs. Net Movement

Figure 4.3: Batting Average Versus Net Movement for All Pitches

There appears to be a correlation ($R^2 = 0.2339$) between batting average and net movement. It would be expected that increased movement reduces the batters chances of getting a hit. In this model, increasing movement by 1 inch results in a 43 point decrease in batting average.

5. Putting it All Together

Finally, a preliminary study was done in order to combine the effects of speed, location and movement. In this model, the following variables were used to describe the pitch:

Speed \rightarrow speed (mph) and fastball or not (1 or 0) Location \rightarrow strike or not (1 or 0) Movement \rightarrow net movement (in)

These variables were used to predict whether the pitch would result in a hit. A logistic regression was used because the dependent variable was binary. Either the pitch resulted in a hit, or the pitch resulted in an out. Pitches that did not result in an at-bat outcome were excluded from the model.

Model Summary

Step	-2 Log	Cox & Snell	Nagelkerke
	likelihood	R Square	R Square
1	6527.920 ^a	.017	.025

a. Estimation terminated at iteration number 4 because parameter estimates changed by less than .001.

Variables in the Equation

		В	S.E.	Wald	df	Sig.	Exp(B)
Step	PitchSpeed	020	.007	8.955	1	.003	.981
1	Net_Move	217	.082	6.892	1	.009	.805
	FBOrNot	.358	.090	15.690	1	.000	1.431
	StrikeOrNot	.560	.074	57.822	1	.000	1.750
	Constant	.536	.653	.673	1	.412	1.709

a. Variable(s) entered on step 1: PitchSpeed, Net_Move, FBOrNot, StrikeOrNot.

The model only accounts for only 2.5% of the variability in whether or not a pitch will result in a hit, given the variables in the equation listed above. Considering the wide range of factors that account the outcome of an at-bat (pitch sequence, defensive

alignment, individual talents, etc.), this result is expected. However, the last column of the second table describes the effect a one unit increase in each variable in the model will do to the odds of the pitch becoming a hit. An increase in 1 mph in pitch speed will result in a 2% decrease of the pitch becoming a hit and an increase in 1 inch in movement will result in a 20% decrease. Fastballs are 43% more likely to produce hits and strikes are 75% more likely to produce hits.

6. Conclusion

Speed, location and movement are all important factors in pitching. Several important conclusions can be drawn from the studies in this paper, all of which support conventional baseball wisdom: (1) Fastballs are much more likely to become hits than off-speed pitches. (2) Additional speed on a pitch will decrease the batter's chances of getting a hit. (3) Pitches within the strike zone are much more likely to become hits than pitches outside of the strike zone. (4) Additional movement on a pitch will decrease the batter's chances the batter's chances of getting a hit.

6.1 Further Study

A more complex model can be created to predict whether a pitch will result in a hit. The variables used in this paper were oversimplified. A better model would account for more specific pitch location, the pitch direction of movement and amount of pitch movement. Additional factors to consider might be the change in speed from the previous pitch and lefty-righty splits. Further considerations might include pitches that do not result in hits or outs such as called pitches, swings and misses, and foul balls.

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