Finding Math in the Madness:

Predicting Upsets in the March Madness Basketball Tournament

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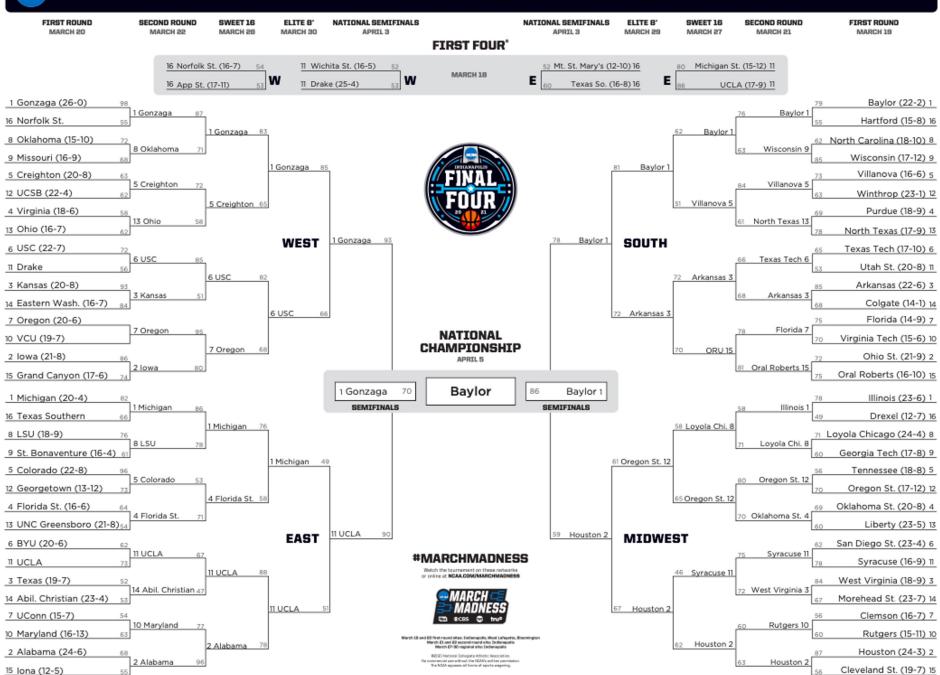






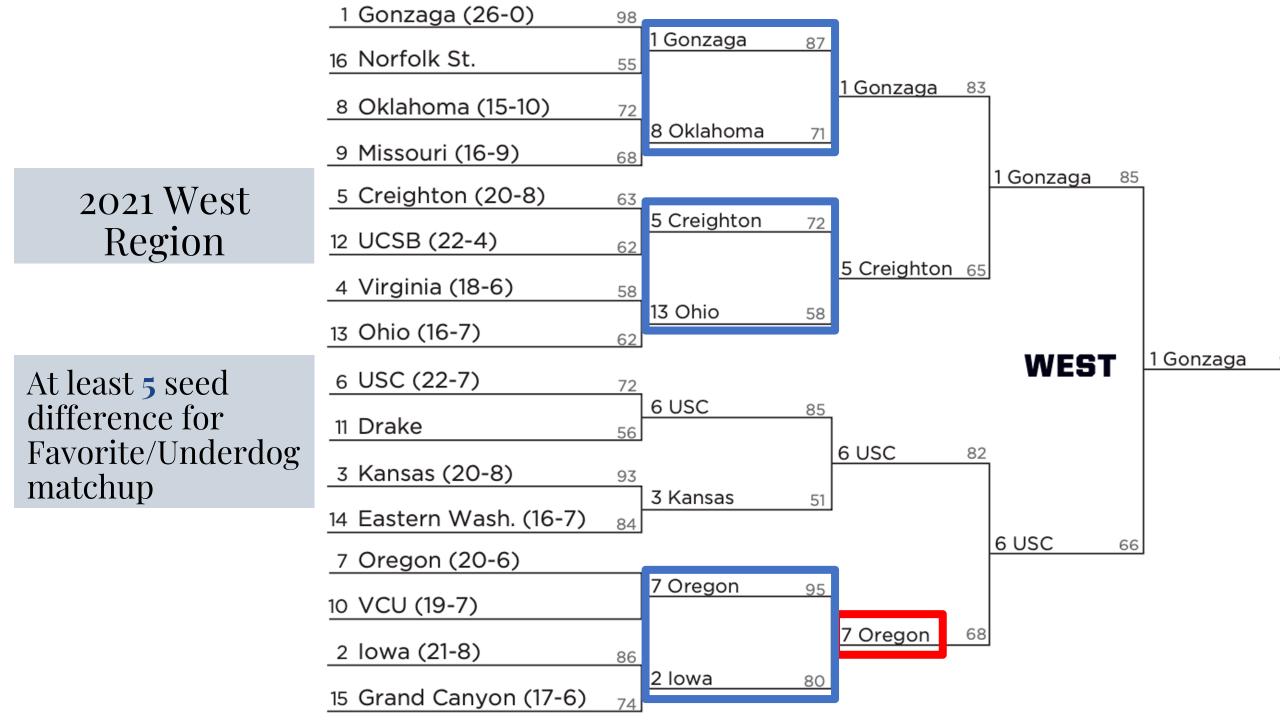
NCAA.com

2021 NCAA DIVISION I MEN'S BASKETBALL CHAMPIONSHIP



Bracket structure

- 68 teams
- 4 regions
- 16 teams per region ranked by seed
- 6 rounds



Focus of our Research

- Historically, 23% of matchups with at least a 5-seed difference were upsets
- Goal: Determine which regular season characteristics of favorites and underdogs result in upsets more/less often than historical average
- Use these characteristics to predict future upsets



Understanding our Data Set

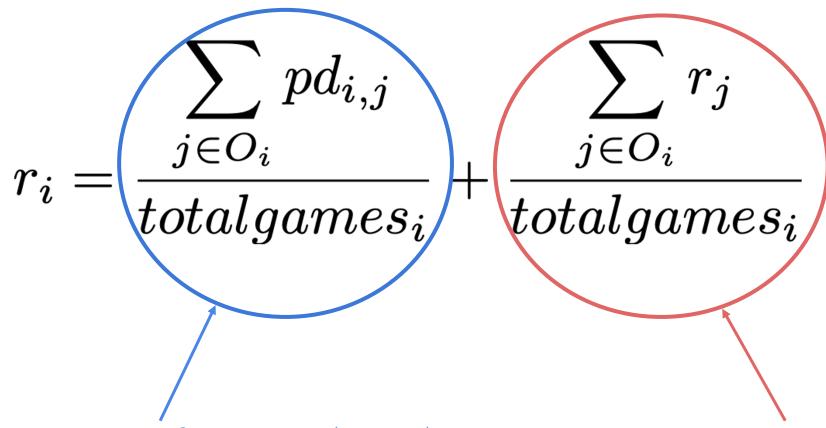
- Regular season and tournament data from 2007-2022
 - Regular season data all D1 teams
 - Tournament data only contains games with seed difference of at least five
 - Use 2007-2021 for model training
 - Reserve 2022 data for future testing
 - No tournament in 2020

Simple Rating System (SRS)

- Used to form a rating, r_i , for each team i
- r_i represents how much better team i is than an average team on a neutral court

Simple Rating System (SRS)

For each team i:



Average margin of victory (MOV) Average opponent strength

Average opponent strength (SOS)

SRS example

3 Kansas

Favorite

 $15.9267 = SRS_{KU}$

14 E Washington

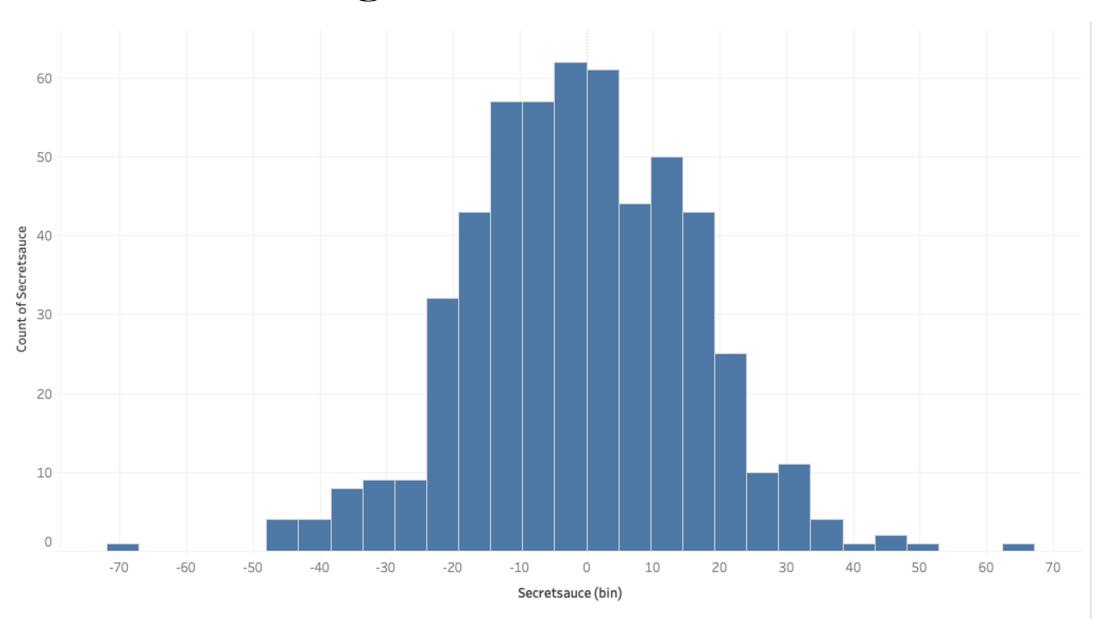
Underdog $3.7227 = SRS_{EWU}$

Predicted MOV: SRS_{KU} - SRS_{EWU} = (12.2040)

Actual MOV: (12.0684)

Secret Sauce: Actual MOV - Predicted MOV = (-0.1356)

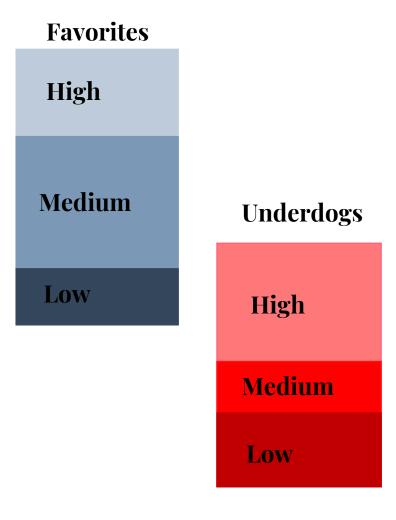
Histogram of Secret Sauce



Multi Variable Analysis

Analysis

• Use data to find historical percentage of upsets in each category

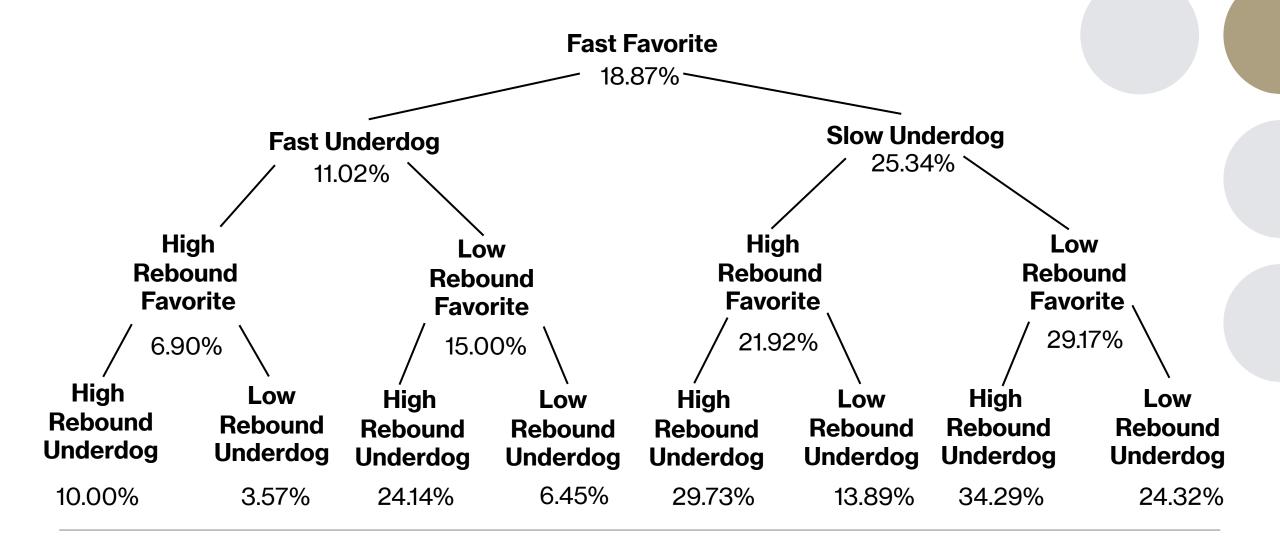


Favorite Offense

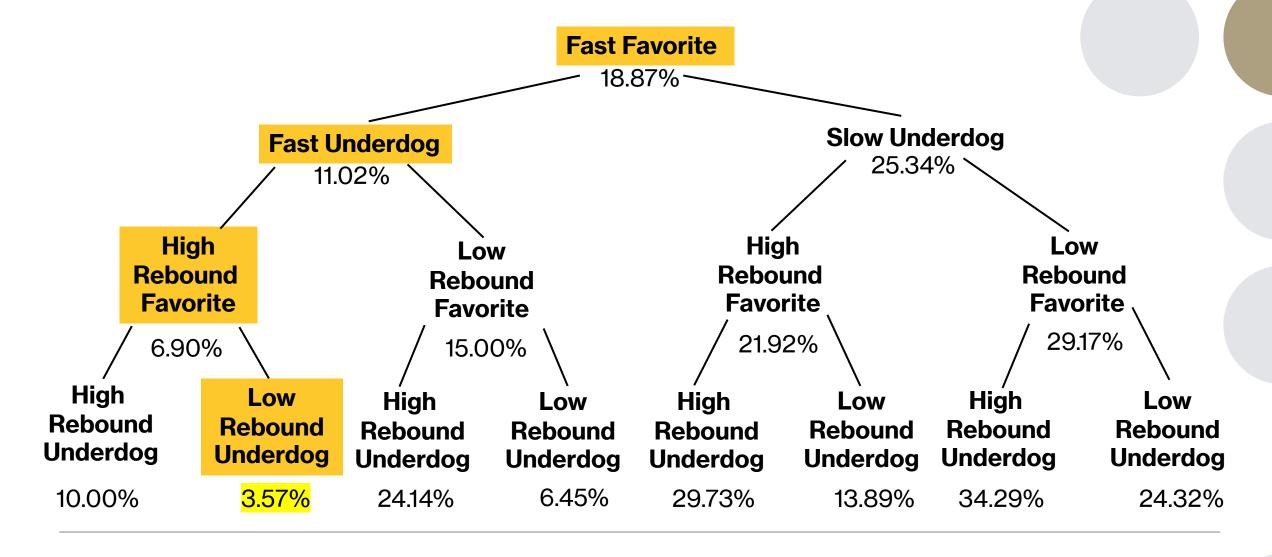


Historical Upset Percentage: 23%

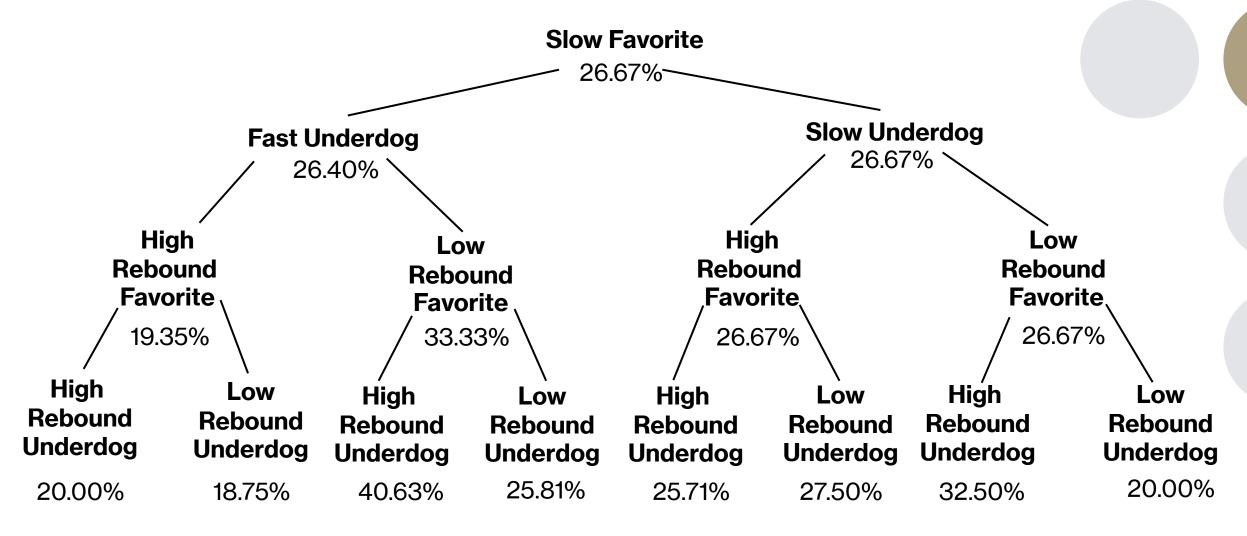
Fast Pace + Rebounds Decision Tree



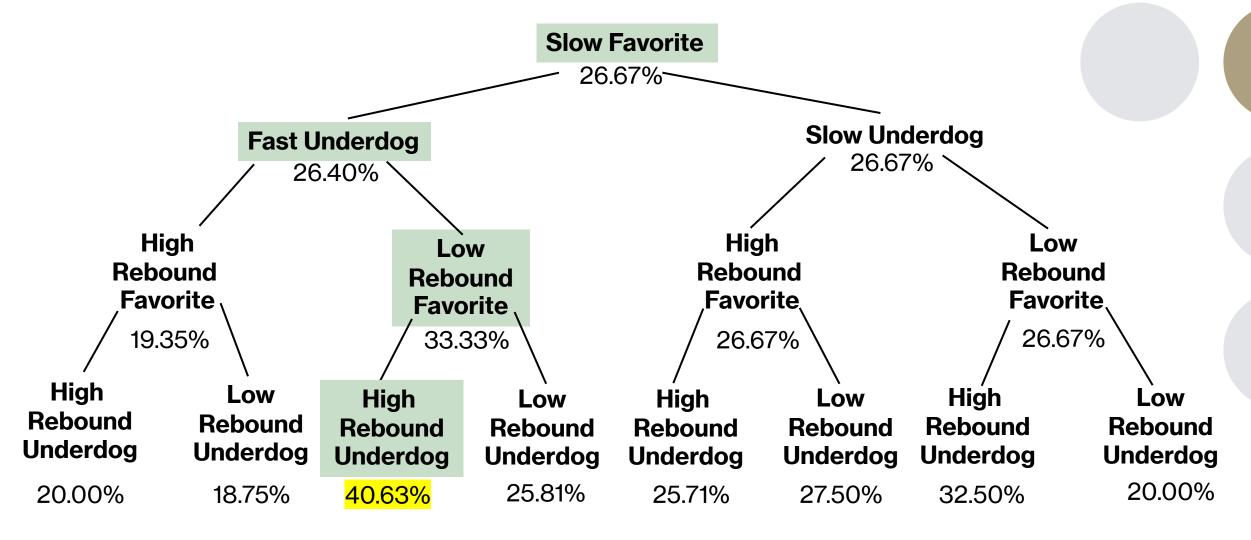
Fast Pace + Rebounds Decision Tree



Slow Pace + Rebounds Decision Tree



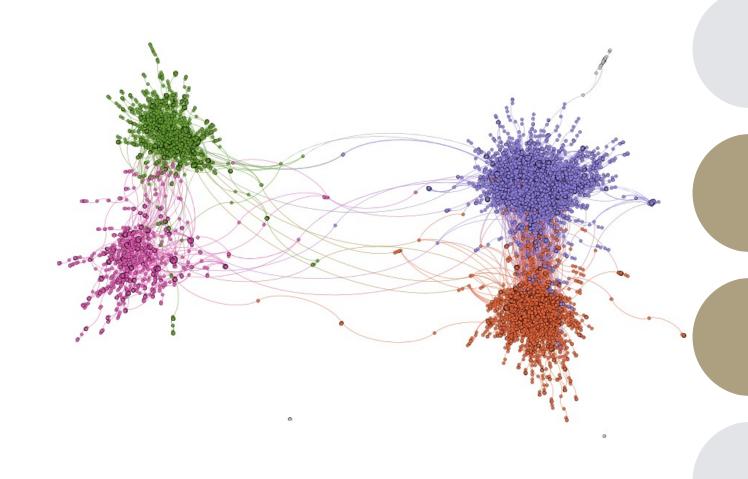
Slow Pace + Rebounds Decision Tree



Community Detection

Two different clustering algorithms

- *k*-means clustering
 - Used to cluster similar teams
- Louvain clustering algorithm
 - o Used to cluster similar **games**



Favorites

		Butter- fingers	Offense Focused	Average Joe	
SS	Power	50%	23.81%	26.15%	32.02%
Underdogs	Defense Focused	35.85%	20.0%	26.42%	28.37%
	Lucky Team	26.79%	9.09%	4.60%	28.37%
		<mark>37.11%</mark>	16.57%	17.07%	

Butterfinger-Power Matchups

Alabama vs UCLA 2021

Tennessee vs Oregon St. 2021

Wisconsin vs Iowa St. 2022

Each node represents a game Upset

percentage

Louvain Clustering Algorithm

Cluster Number

1	2	3	4
18.58%	23.53%	34.59%	16.44%

Gonzaga vs Georgia State (2022)

- Michigan vs Texas Southern (2021)
- Kansas vs Detroit Mercy (2012)
- Villanova vs Radford (2018)
- Kansas vs Boston University (2011)
- Florida vs Jackson St (2007)
- Oklahoma vs CSU Bakersfield (2016)
- Kentucky vs Western Kentucky (2012)
- Oklahoma vs Morgan St (2009)
- Florida vs Northwestern St (2013)
- Kansas vs Western Kentucky (2013)

o of the 10 most similar games were upsets

Villanova vs Michigan (2022)

3

34.59%

16.44%

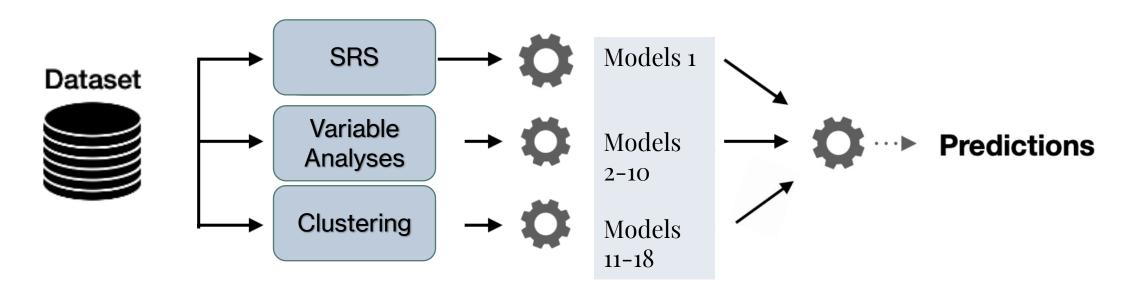
•	Brigham	Young vs	Gonzaga	(2011)	
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- SMU vs UCLA (2015)
- Memphis vs Saint Mary's (2013)
- Duke vs California (2010)
- Villanova vs Saint Mary's (2009)
- Villanova vs Saint Mary's (2010)
- Texas A&M vs Utah St. (2010)
- Duke vs West Virginia University (2008)
- St. Johns vs Gonzaga (2011)
- Memphis vs Nevada (2007)

4 of the 10 most similar games were upsets

Ensemble Model

Singular model made up of our 18 initial models, with preferential weighting given to models that are more predictive



Ensemble Model

- Purpose: pick models that offer new information other models lack
- After each iteration, each newly picked model has less voting power
- Newly picked model is the best model at correctly predicting the games that the previous models mispredicted
- Drawback: risk of overfitting our ensemble model to predict rare occurrences

Testing Our Model on 2022 Games

Actual

		Upsets	Non upsets
	Upsets	9	3
	Non upsets	7	27

Correct predictions: 76.74%

Predicted

2022 Games our Model Predicted as Upsets

Game	Score	Is upset
Saint Mary's vs Indiana	82 - 53	0
Colorado St vs Michigan	63 - 75	1
Texas vs Virginia Tech	81 – 73	0
Alabama vs Notre Dame	64 - 78	1
LSU vs Iowa St	54 - 59	1
Baylor vs North Carolina	86 - 93	1
Tennessee vs Michigan	68 - 76	1
Texas Tech vs Notre Dame	59 - 53	0
Wisconsin vs Iowa St	49 - 54	1

Thank you!

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ESPN
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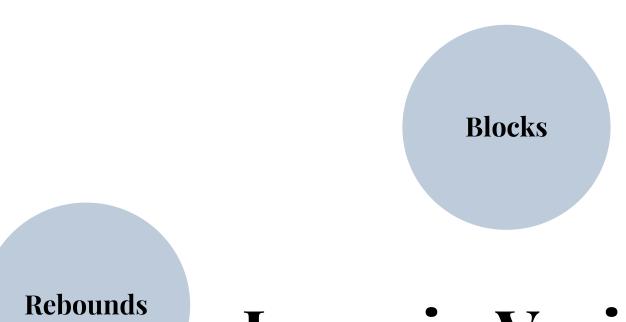


k-means Clusters of Favorite Teams

		Variables		
	Rebounds	Rebound prevention	Turnover rate	Offense
Butterfingers Cluster				V
Offense-Focused Cluster				
Average Joe Cluster				

k-means Clusters of Underdog Teams

	Variables			
	SOS	Rebounds	Defense	Field Goals
Power Cluster				
Defense-Focused Cluster				
Lucky Team Cluster				



Field Goals

Louvain Variables

Rebound Prevention Field Goal Prevention

Current Models

Single and Multi-Variable Analyses

- Pace
- Rebounds
- Turnovers
- Three pointers
- Strength of Schedule
- Offense
- Defense

Clustering

- Similar teams: *k*-means and Louvain
- Similar games: Louvain

SRS Scores

• Simple SRS

Favorite SOS

		Low	Medium	High	
SOS	Low	10.53%	13.85%	10.81%	11.86%
Underdog S	Medium	24.0%	14.81%	31.91%	23.30%
Und	High	28.13%	31.58%	36.67%	<mark>32.04%</mark>
		23.03%	20.22%	25.14%	

Historical Upset Percentage: 23%

Lift chart

