# He Shoots, He Scores!: <br> Simpson's Paradox in KSU basketball field goal statistics 

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## KSU Men's Basketball 2000-01

Who was the best shooter?

|  | Trevor Huffman |  |  | Bryan Bedford |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Made | Att | Avg | Made | Att | Avg |
| 2-pointers | 57 | 127 | $\mathbf{0 . 4 4 9}$ | 13 | 30 | 0.433 |
| 3-pointers |  |  |  |  |  |  |
| all field goals |  |  |  |  |  |  |

So far, looks like Huffman.

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Yeah, it's Huffman.

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But, wait, be careful...

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Not so fast...

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Hmmm.... Is it Huffman or Bedford?

## Simpson's Paradox

- Trend in data reverses when two or more categories are combined
- Described by
- Karl Pearson, et al. (1899)
- Udny Yule (1903)
- Edward H. Simpson (1951)
- Famous examples (see Wikipedia)
- UC Berkeley gender bias case (grad school admission) (1973)
- Kidney stone treatment study (1986)
- Batting averages


## Simpson's Paradox

Why is it paradoxical?

- Our intuition tells us the average for the combined data should be the midpoint of the averages of the two categories.
- This is true if the categories are weighted equally (ratios have the same denominators).



## Simpson's Paradox

- In fact, the overall average can be anywhere between the two category averages.
$75 \%$ data in Category A - 25\% data in Category B


25\% data in Category A - 75\% data in Category B A+B


## Simpson's Paradox

$$
a<A \text { and } b<B
$$


but $a+b>A+B$ (where $a+b$ denotes overall average)

Back to basketball: Lurking variables

|  | Trevor Huffman |  |  | Bryan Bedford |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Made | Att | Avg | Made | Att | Avg |
| 2-pointers | 57 | 127 | $\mathbf{0 . 4 4 9}$ | 13 | 30 | 0.433 |
| 3-pointers | 35 | 100 | $\mathbf{0 . 3 5 0}$ | 0 | 1 | 0.000 |
| all field goals | 92 | 227 | 0.405 | 13 | 31 | 0.419 |

- $\frac{100}{227}=44 \%$ of Huffman's shots were 3-pointers
- Only $\frac{1}{31}=3 \%$ of Bedford's shots were 3 -pointers
- 3-pointers are harder

Lurking variable: 3-pointers are hard

## Huffman:



## Bedford:

3\% 3-pointers - 97\% 2-pointers

$$
0.000<0.0419<0.433
$$

Another example: 2002-03 season

|  | Anthony Wilkins |  |  | Antonio Gates |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Made | Att | Avg | Made | Att | Avg |
| 2-pointers | 31 | 56 | $\mathbf{0 . 5 5 4}$ | 216 | 440 | 0.491 |
| 3-pointers | 67 | 171 | $\mathbf{0 . 3 9 2}$ | 15 | 43 | 0.349 |
| all field goals | 98 | 227 | 0.432 | 231 | 483 | 0.478 |

- 75\% of Wilkins's shots were 3-pointers
- Only 9\% of Gates's shots were 3-pointers
- Gates now plays tight end for the Chargers

Women can be paradoxical, too

|  | Jamie Rubis |  |  | Lindsay Shearer |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Made | Att | Avg | Made | Att | Avg |
| 2-pointers | 119 | 234 | $\mathbf{0 . 5 0 9}$ | 86 | 170 | 0.506 |
| 3-pointers | 36 | 97 | $\mathbf{0 . 3 7 1}$ | 5 | 21 | 0.238 |
| all field goals | 155 | 331 | 0.468 | 91 | 191 | 0.476 |

- $29 \%$ of Rubis's shots were 3-pointers
- Only $11 \%$ of Shearer's shots were 3-pointers


## Simpson's Paradox Challenge

These and other examples from my KSU's stats can be found at

www.math.kent.edu/~darci/simpson

Can you find examples in your KSU's stats?

Pi Mu Epsilon Kansas Beta Chapter-Kansas State University


## The Society's Goals:

- To elect members on an honorary basis according to their proficiency in mathematics
- To promote activities that enhance the mathematical and scholarly development of its members
- Founded at Syracuse University on December 8th, 1913
- Named using Greek letters stemming from the Greek words for scholarship (Pi), mathematics (Mu), and promotion (Epsilon)
- Incorporated on May 25th, 1914. Re-incorporated in 1988.
- A national society comprised of local chapters at colleges and universities.
- Currently there are 384 chapters in 48 states and the District of Columbia.
- Each chapter is designated by its own Greek Letter and a chapter number.
- The Kansas Beta Chapter (chapter 31) was chartered at Kansas State University in 1935


## The Society Council

- Angela Spalsbury, Ohio Xi at Youngstown State University (President)
- Paul Fishback, Michigan lota at Grand Valley State University (President-Elect)
- Eve Torrence, Virginia lota at Randolph-Macon College (Past-President)
- Stephanie Edwards, Michigan Delta at Hope College (Secretary-Treasurer)
- Brigitte Servatius, Massachusetts Alpha at Worcester Polytechnic Institute (Journal Editor)
- Councilors
- Chad Awtrey, North Carolina Nu at Elon University
- Jennifer Beineke, Massachusetts Kappa at Western New England University
- Darci Kracht, Ohio Epsilon at Kent State University
- Ben Ntatin, Tennessee Epsilon at Austin Peay University


## Activities of the National Organization

Financial support for various organizations:

- American Mathematics Competitions
- American Regional Mathematics League
- Mathematical Association of America (MAA) National Meeting Poster Session


## Activities of the National Organization

Chapter Grants:

- Matching Prize Grants (\$100)
- Matching Conference Grants (\$300)
- Richard A. Good Lectureship Grants (\$500)


## Activities of the National Organization

The Pi Mu Epsilon Journal


- Published in the fall and spring of each year
- Cash prizes for student-authored articles
"This award had a MAJOR impact on my vision for a research career." Robert Devaney, Boston University, MAA Past-President

The 2015 National Pi Mu Epsilon Conference

in conjunction with MAA MathFest 2015
August 5th-8th
Washington, DC

## Opening Reception at the National PME Meeting



## Student Presentations at the National PME Meeting

Fifteen-minute talks may be expository on material most undergraduates have not seen in their classrooms or on new research accomplished while an undergraduate.


## Student Presentations at the National PME Meeting

Sample titles from the 2014 Conference:

- Computational Models of Congressional Redistricting
- Exploring Leibnizs Infinitesimals
- Integer Compositions Applied to the Probability Analysis of Blackjack and Infinite Deck Assumption
- A Quantitative Analysis of SIR-type Malaria Models
- Mathematical Manipulatives from 3D Printing
- Using Independent Bernoulli Random Variables to Model Gender Hiring Practices


## Activities Sponsored by the Mathematical Association of America

- Cirque de Mathematiques: A Combination of Drama, Magic, Mime and Dance
- The Man Who Knew Infinity: Sneak Peek and Expert Panel
- Mathematicians by Day, Musicians by Night
- Student Poster Sessions and Other Undergraduate Activities

Pi Mu Epsilon Banquet and Awards Ceremony


Awards for Student Talks at the National PME Meeting


Talks are judged, and cash prizes (\$150) are awarded by several professional organizations:

- The American Mathematics Society
- The MAA Special Interest Groups on Mathematical Biology and Environmental Mathematics
- The American Statistical Association
- The Society for Industrial and Applied Mathematics
- Budapest Semesters in Mathematics


## 2015 J. Sutherland Frame Lecture



Professor Noam Elkies, Harvard University

- PME provides transportation support for up to 5 student speakers from each Chapter: up to $\$ 600$ per student with a $\$ 1200$ per Chapter maximum.
- An NSA grant provides a stipend to help defray lodging and food expenses. (in 2014: $\$ 380$ each)
- Almost all PME student speakers receive travel and sustenance grants.
- For further details, see www.pme-math.org/apply-for-funding.


## 2014 Student Speakers



## Student Survey Comments

- "MathFest is an excellent opportunity to expand your mathematical knowledge, meet distinguished mathematicians, and learn about careers in your field. It was a wonderful and fun experience and you should definitely participate."
- "I would tell students that they should participate and give a talk. It has been a memorable and great experience that will help me in several ways in the future."


## The Meaning of the Shield:



## The Pi Mu Epsilon Pledge:

I solemnly promise
that I will exert my best efforts to promote true scholarship, particularly in mathematics, and that I will support the objectives of the Pi Mu Epsilon Honor Society.

