

# Loaded Dice

William Gasarch - University of MD

## If You Roll Two Standard 6-Sided Dice Then

1. 2: (1,1). ONE way. Prob  $\frac{1}{36}$ .
2. 3: (1,2), (2,1). TWO ways. Prob  $\frac{1}{18}$ .
3. 4: (1,3), (2,2), (3,1). THREE ways. Prob  $\frac{1}{12}$ .
4. 5: (1,4), (2,3), (3,2), (4,1). FOUR ways. Prob  $\frac{1}{9}$ .
5. 6: (1,5), (2,4), (3,3), (4,2), (5,1) FIVE ways. Prob  $\frac{5}{36}$ .

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6. 7: (1,6), (2,5), (3,4), (4,3), (5,2), (6,1) SIX ways. Prob  $\frac{1}{6}$ .

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7. 8: (2,6), (3,5), (4,4), (5,3), (6,2) FIVE ways. Prob  $\frac{5}{36}$ .
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9. 10: (4,6), (5,5), (6,4) THREE ways. Prob  $\frac{1}{12}$ .
10. 11: (5,6), (6,5) TWO ways. Prob  $\frac{1}{18}$ .
11. 12: (6,6) ONE way. Prob  $\frac{1}{36}$ .

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**Question 1** Can we load two 6-sided dice so that every number from 2 to 12 has the **same** probability. Called **fair sums**.

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**How Unfair?:**  $1/6 - 1/36 \sim 0.139$  unfair.

# What Are Loaded Dice?

**Def:** A **Die** is a 6-tuple  $(p_1, p_2, p_3, p_4, p_5, p_6)$  such that  $0 \leq p_i \leq 1$  and  $\sum_{i=1}^6 p_i = 1$ .

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**The coefficient of  $x^i$  is  $\text{Prob}(\text{sum} = i)$**

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Continued on Next Slide.

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From last slide: If there are two loaded dice that give fair sums then there exist reals  $(p_1, \dots, p_6), (q_1, \dots, q_6)$  such that

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1.  $r$  root of  $x^{10} + \dots + x + 1 \implies r$  root of  $x^{11} - 1$  &  $r \neq 1$ .
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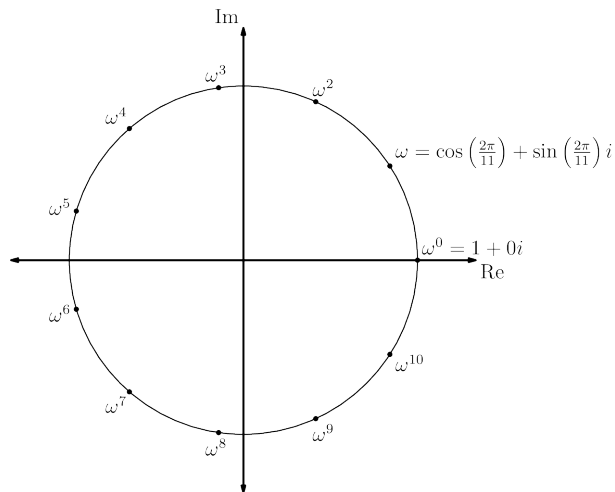
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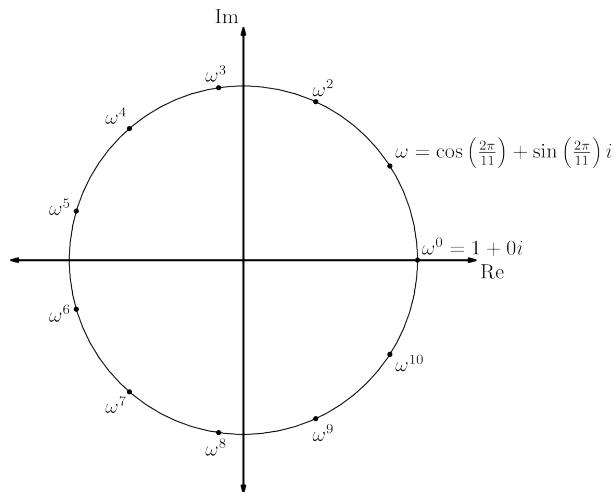
The roots of  $x^{11} - 1$  are on the complex unit circle. See Next Slide.

# The 11th Roots of Unity: Only Real one is 1



1 is only real 11th root of unity.

# The 11th Roots of Unity: Only Real one is 1



1 is only real 11th root of unity.  $x^{10} + \dots + 1 = 0$ : **no** real roots.

# No Dice (cont)

## Recap

If there exists two 6-sided dice that give fair sums then there exists reals  $p_1, \dots, p_6, q_1, \dots, q_6$  such that

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## Contradiction

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2. The proof that for **odd  $d$**  you **cannot** load two  $d$ -sided dice to get fair sums requires a few tricks. We leave that to you.

# Can You Ever Load Dice to Get Fair Sums?

Is there a  $d_1, d_2 \geq 2$  such that there are  $d_1$ -sided and  $d_2$ -sided dice that give fair sums?

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Prob of a 3 is  $\frac{1}{2} \times 0 + \frac{1}{2} \times \frac{1}{2} = \frac{1}{4}$ .

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Answer on Next Slide.

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**Fame!** One paper refers to **The Gasarch-Kruskal Thm**.

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How far are normal dice from uniform?

$$2(1/11 - 1/36)^2 + 2(1/11 - 1/18)^2 + 2(1/11 - 1/12)^2 + 2(1/9 - 1/11)^2 +$$

$$2(5/36 - 1/11)^2 + (1/6 - 1/11)^2 \sim 0.0217$$

## How Close To Uniform Can You Get? (cont)

**Thm** The optimal pair of 6-sided dice is  $(\frac{1}{2}, 0, 0, 0, 0, \frac{1}{2})$  and  $(\frac{1}{8}, \frac{3}{16}, \frac{3}{16}, \frac{3}{16}, \frac{3}{16}, \frac{1}{8})$ .

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If you use two  $n$ -sided fair dice then the the distance from uniform sums is  $\frac{2n^2+1}{3n^3} - \frac{1}{2n-1} \sim \frac{1}{6n}$ .