

# Counting on Coincidences

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It's easier to compute the probability that everyone has a **different** birthday.

Let  $P(N)$  be the probability that  $N$  random people have **different** birthdays.

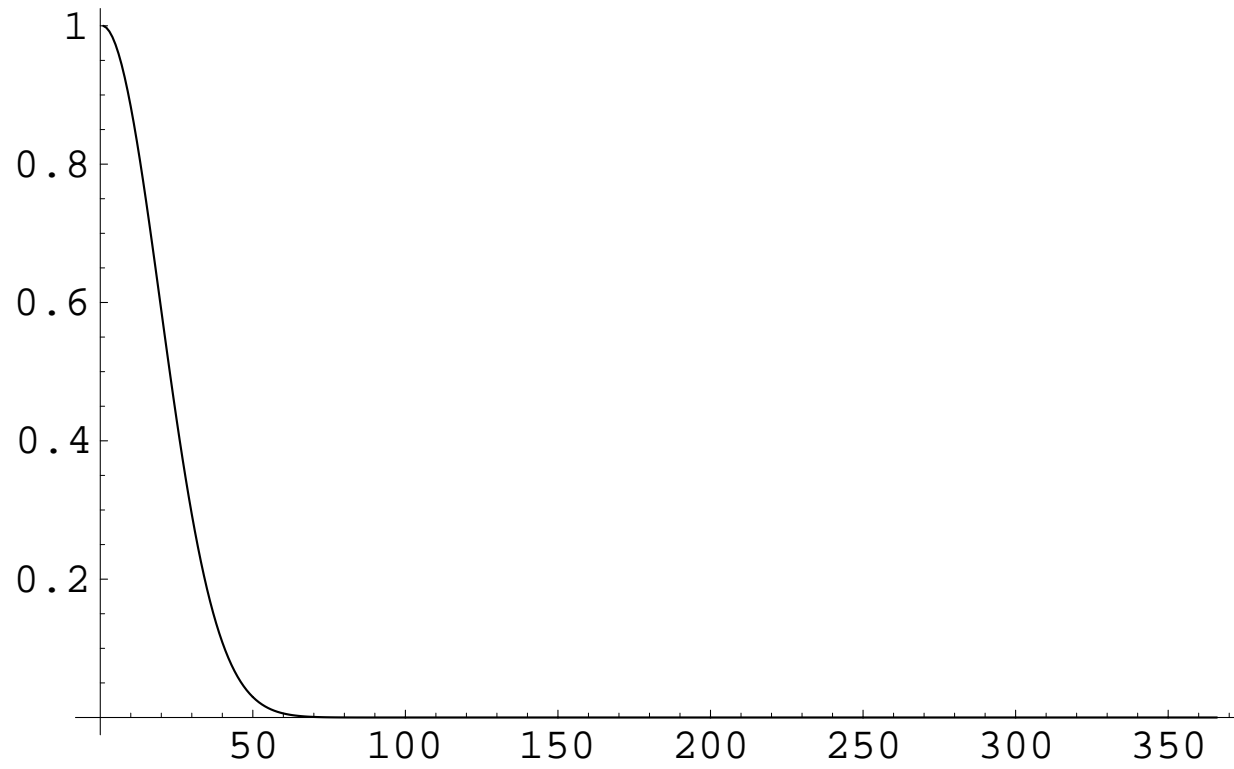
$$P(1) = 1$$

$$P(2) = 1 \cdot \frac{364}{365} \approx .99726$$

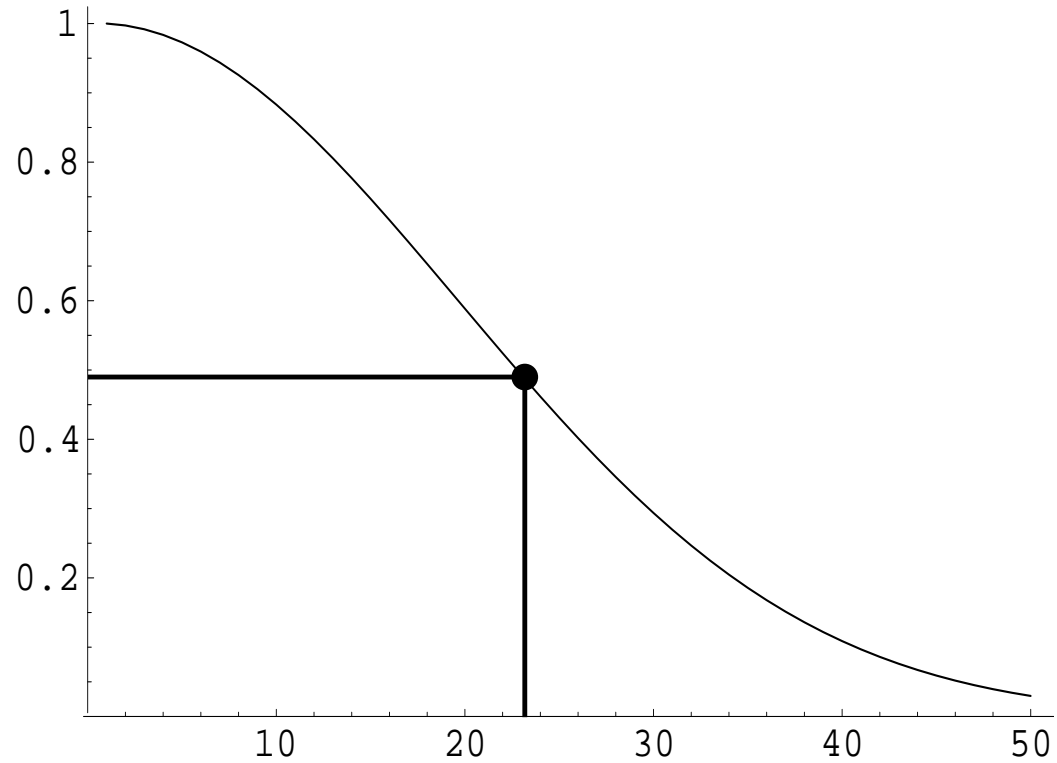
$$P(3) = 1 \cdot \frac{364}{365} \cdot \frac{363}{365} \approx .991796$$

$$P(4) = 1 \cdot \frac{364}{365} \cdot \frac{363}{365} \cdot \frac{362}{365} \approx .983644$$

$$P(N + 1) = P(N) \cdot \frac{365 - N}{365}$$



Probability of different birthdays for  $N$  people



Probability of different birthdays,  $N \leq 50$

$$P(22) \approx 0.524$$

$$P(50) \approx 0.0296$$

$$P(23) \approx 0.492$$

$$P(60) \approx 0.00587$$

$$P(30) \approx 0.293$$

$$P(70) \approx 0.000840$$

$$P(40) \approx 0.108$$

$$P(100) \approx 0.0000000307$$



A lottery sells a million tickets each day and chooses one winner every day.

What is the chance that someone wins twice in a year?

- (a) about 1 in a trillion
- (b) about 1 in a billion
- (c) about 1 in a million
- (d) about 1 in a thousand
- (e) about 1 in a hundred
- (f) about 1 in ten
- (g) about 50-50

(Assume same million players every day.)



**Answer:** Probability of 365 different winners is

$$1 \cdot \frac{999,999}{1,000,000} \cdots \frac{999635}{1000000} \approx .9353.$$

6.5% chance of a double winner in **one year**.

45% chance of double winner in **3 year** period.

99.87% chance of a double winner in **10 years**.

Suppose we randomly put  $K$  balls into  $N$  boxes. What is the chance that no box has more than  $M$  balls in it?

Call this probability  $P(K, N, M)$ .

The Birthday Problem is computing  $P(K, 365, 1)$ .

**MIDTERM:** What is  $P(14400, 9000, 7)$ ?

- (a) .0000000000000000000000000000000132
- (b) .095395
- (c) .664954
- (d) .999323
- (e) .999999999999999999999999999999845

If we drop 14,400 balls into 9000 boxes, what is the chance no box has more than 7 balls in it?

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**Why is this an important example?**

In 1960 there were 14,400 cases of leukemia in US and 8 cases in Niles, IL, population 20,000.

The **average** for a town this size would be 1.6 cases.

Is the cluster random?

Population of US in 1960 was

$$180,000,000 = 9,000 \times 20,000.$$

Divide population into 9,000 “boxes” of 20,000 each.

Drop in 14,400 “cases”.

What is the chance that some box has 8 cases?

**Answer** =  $1 - P(14400, 9000, 7)$ .

**Calculation gives**  $P(14400, 9000, 7) = .095395$

The probability of some town of size 20,000 having 8 cases at random is about 90%.

N	Probability biggest cluster $\leq N$	Probability biggest cluster $> N$
6	.000005	.999995
7	.095395	.904605
8	.664954	.335046
9	.937864	.062137
10	.990843	.009157
11	.998788	.001212
12	.999852	.000148

A town of 20,000 with 8 or 9 cases is highly likely.

Probability of 11 cases at random is about 1%.



## **A counting problem:**

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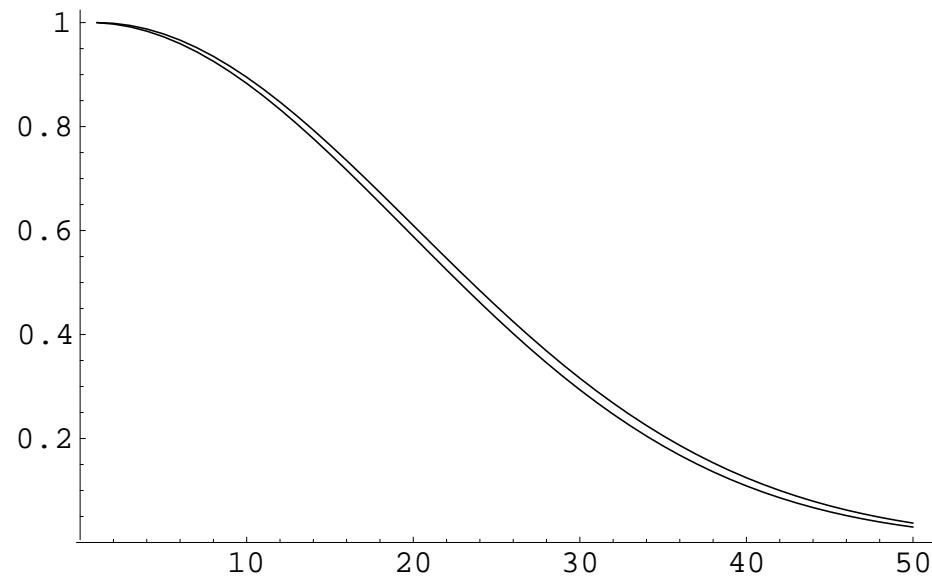
**Answer:**  $\approx \sqrt{N}$

$N$  balls into  $K$  boxes. Chance of “no repeats”:

Exact Formula:

$$P(N) = 1 \cdot \frac{K-1}{K} \cdots \frac{K-N+1}{K}$$

Approximate Formula:  $P(N) \approx e^{-N^2/2 \cdot K}$



Comparing exact and approximate formulas

How long before a 50% chance of a repeat?

Must solve

$$e^{-N^2/2K} = .5$$

$$\frac{-N^2}{2K} = \log .5$$

$$N = \sqrt{2K \log 2} \approx 1.17741\sqrt{K}$$

If we draw  $N \approx \sqrt{K}$  random samples (with repetition) from a bag with  $K$  items, we have a good chance to get a repeat.

## Counting balls in a bag problem

### **Rough guess:**

If first repeat in on the  $n$ th draw from the bag, guess  $K = (n/1.1774)^2$  as number of balls in bag.

Repeat and take average for better estimate.

## Better solution:

Examine and return  $m$  samples.

Let  $t$  be total number of repeats.

Estimate  $K \approx \frac{m(m-1)}{2t}$

Estimate is probably accurate if  $m \gg \sqrt{K}$ .



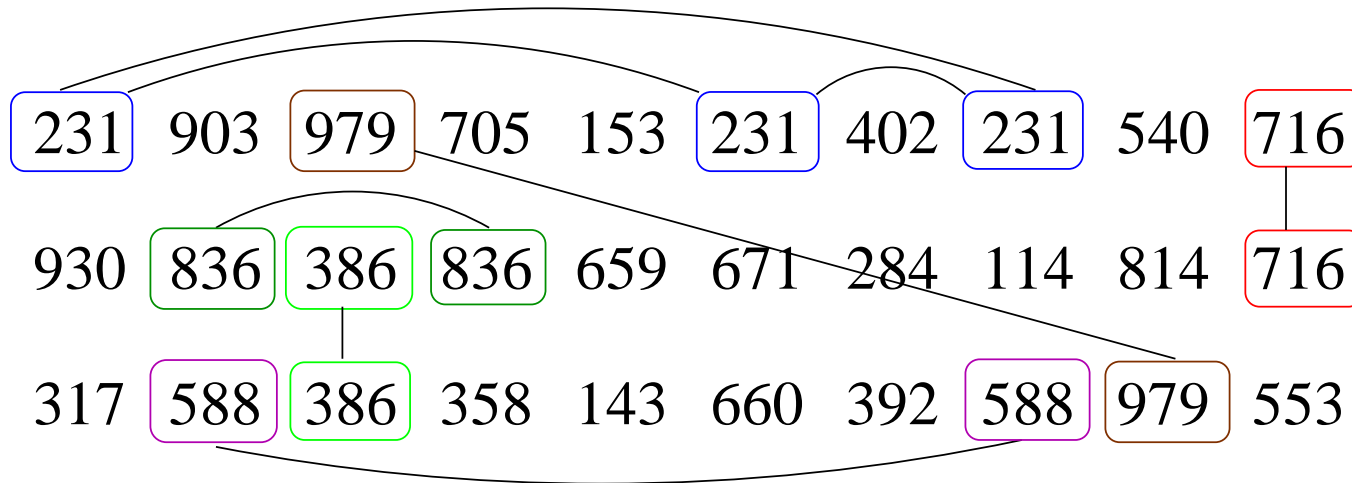
**Example:** I picked  $K$  distinct 3 digit numbers, then drew 30 random samples:

231 903 979 705 153 231 402 231 540 716

930 836 386 836 659 671 284 114 814 716

317 588 386 358 143 660 392 588 979 553

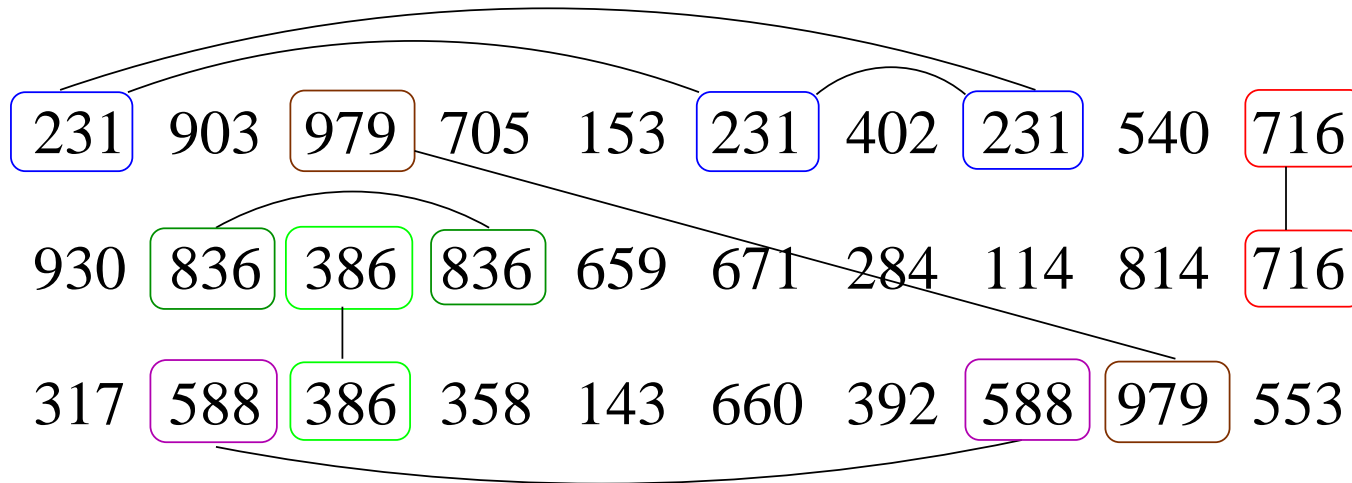
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There are  $m = 30$  samples and  $t = 8$  pairs of repeated numbers, so our guess is

$$\frac{m(m - 1)}{2t} = \frac{30 \cdot 29}{16} \approx 54.375.$$

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The true  $K$  is 57.

## **Applications:**

Counting fish in lake

Counting distinct users on internet

Cryptography (security of digital signatures)

Factoring integers (Pollard rho method)

Many others

## FINAL EXAM

Two thieves steal  $N$  diamonds with random values between \$1 and \$1,000,000. Can they divide the loot into two piles of equal value?

Impossible if  $N = 1$  and unlikely if  $N = 2, 3, \dots$ ?

There is a 50% chance even splitting if  $N > ?$

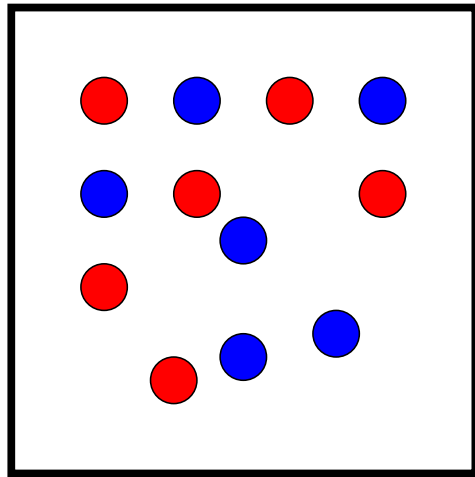
- (a) 11
- (b) 25
- (c) 78
- (d) 979
- (e) 10,122

Divide diamonds into two groups of size  $N/2$ .

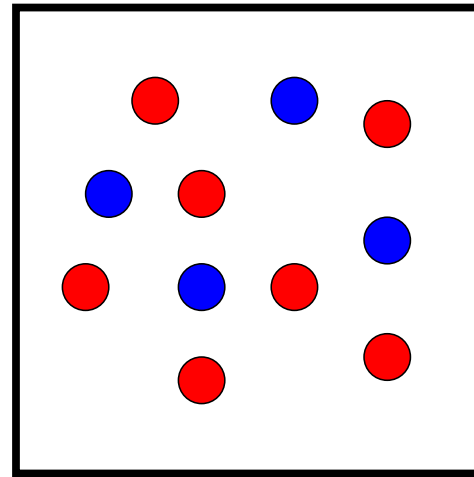
Randomly divide 1st group into red and blue subsets.

Let  $R_1, B_1$  be the value of each subset.

Let  $D_1 = R_1 - B_1$ . Similarly  $D_2 = R_2 - B_2$ .



$$D_1 = R_1 - B_1$$



$$D_2 = R_2 - B_2$$

There are  $2^{N/2}$  ways to obtain  $D_1$ . Same for  $D_2$ .

If  $D_1 = D_2$  then

$$R_1 - B_1 = R_2 - B_2,$$

$$R_1 + B_2 = R_2 + B_1,$$

so we get a division into two equal parts.

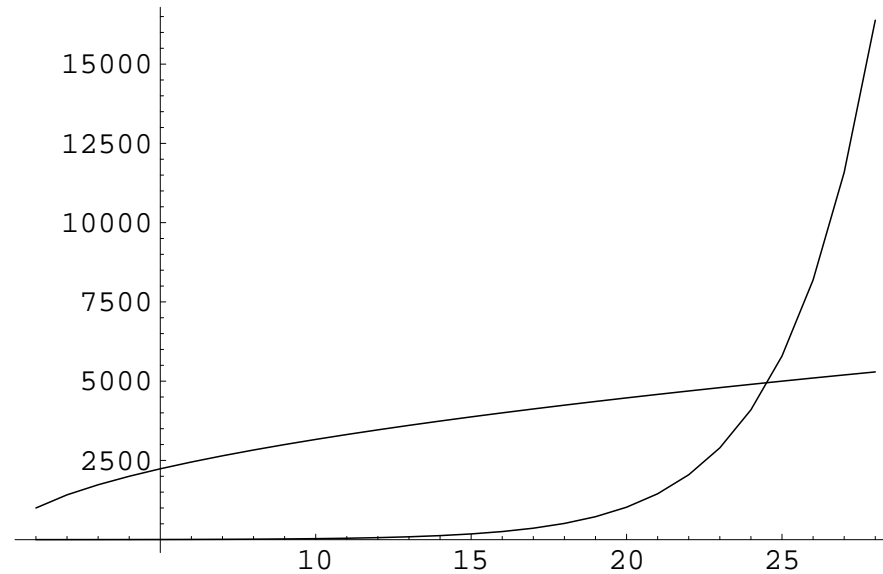
**What is the chance  $D_1 = D_2$ ?**

What is chance of a repeat among  $2^{N/2}$  random numbers of size between  $-\frac{N}{2} \cdot 1,000,000$  and  $\frac{N}{2} \cdot 1,000,000$ ?

By Birthday Problem the odds  $\approx$  50-50 if

# random choices  $\approx \sqrt{\# \text{ possible choices}}$

$$2^{N/2} = \sqrt{N \times 1,000,000}$$



**Answer:** An equal division is likely if  $N \geq 25$ .



**Number Partition Problem:** given  $N$  integers can we divide them into two subsets with same sum?

This is an **NP-hard problem**. Roughly requires checking  $\approx 2^N$  possible subsets in worst case.

Randomly choose  $N$  numbers in the range  $[1, 2^{\kappa N}]$ :

- there usually is an equal division if  $\kappa < .96$
- there is usually not an equal division if  $\kappa > .96$

The Number Partition Problem is only NP-hard problem that has such a precise analysis. Studied by computer scientists, mathematicians and physicists.

Nicknamed the “easiest” NP-hard problem.

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