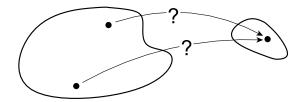


# CS 553

Lecture 19
Hash Collisions &
The Birthday Paradox

Instructor Dr. Dhiman Saha

- ► Finding collisions
  - ▶ Get  $x \neq x'$  such that h(x) = h(x')



#### Can we do better?

- ► We know how second preimage routine can be used to find collision
- ▶ But complexity is  $2^n$

Much easier to find matching objects than finding a particular object.

► A very famous problem in this regard:

The fundamental idea behind collision algorithms

The Birthday Problem or The Birthday Paradox

# Consider the following questions

#### In a random group of 40 people:

- What is the probability that someone has the same birthday as you?
- ► What is the probability that at least two people share the same birthday?

## Any guesses

- ► Are the answers to these questions similar
- ► Or very different

# Consider the following questions

#### In a random group of 40 people:

- What is the probability that someone has the same birthday as you?
- ► What is the probability that at least two people share the same birthday?

## Any guesses

- ► Are the answers to these questions similar
- ▶ Or very different ✓

What is the probability that someone has the **same** birthday as **you**?

## A Common Mistake<sup>1</sup>

▶ Probability of one person sharing your birthday =  $\frac{1}{365}$ 

¹Think how this scales with the number of people < □ > < ② > < ② > < ② > < ② > < ② > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ ○ < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○

What is the probability that someone has the **same** birthday as **you**?

## A Common Mistake<sup>1</sup>

- ▶ Probability of one person sharing your birthday =  $\frac{1}{365}$
- ► Then in a crowd of 40 people, the probability of someone having your birthday is approximately

$$\frac{40}{365} \approx 11\%$$
 Overestimate!!!

What is the probability that someone has the **same** birthday as **you**?

# A Common Mistake<sup>1</sup>

- Probability of one person sharing your birthday =  $\frac{1}{365}$
- ► Then in a crowd of 40 people, the probability of someone having your birthday is approximately

$$\frac{40}{365} \approx 11\%$$
 Overestimate!!!

▶ Double counts the occurrences of more than one person in the crowd sharing your birthday.

¹Think how this scales with the number of people < □ > < ② > < ② > < ② > < ② > < ② > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○ > < ○

# The Right Way to Count

## Consider the complementary event

None of the people share your birthday.

$$\begin{array}{l} \Pr \left( \begin{array}{c} \text{someone has} \\ \text{your birthday} \end{array} \right) = 1 - \Pr \left( \begin{array}{c} \text{None of the 40 people} \\ \text{have your birthday} \end{array} \right) \\ = 1 - \prod_{i=1}^{40} \Pr \left( \begin{array}{c} i^{th} \text{ person does not} \\ \text{have your birthday} \end{array} \right) \\ = 1 - \left( \frac{364}{365} \right)^{40} \\ \approx 10.4\% \end{array}$$

What is the probability that at least two people share the same birthday?

Again Right way to count

Compute the probability that all 40 people have **different** birthdays.

 $ightharpoonup i^{th}$  person should have a birthday that is different from all of the previous (i-1) peoples birthdays.

# How to compute?

- Among the 365 possible birthdays, the previous (i-1) people have taken up (i-1) of them.
- Probability that the  $i^{th}$  person has his or her birthday among the remaining 365 (i 1) days is

$$\frac{365 - (i-1)}{365}$$

$$\begin{array}{l} \Pr \left( \begin{array}{c} \text{two people have} \\ \text{the same birthday} \end{array} \right) = 1 - \Pr \left( \begin{array}{c} \text{all 40 people have} \\ \text{different birthdays} \end{array} \right) \\ = 1 - \prod_{i=1}^{40} \Pr \left( \begin{array}{c} i^{th} \text{ person does not} \\ \text{have the same birthday} \\ \text{as any of the previous} \\ (i-1) \text{ people} \end{array} \right) \\ = 1 - \prod_{i=1}^{40} \frac{365 - (i-1)}{365} \\ = 1 - \frac{365}{365} \cdot \frac{364}{365} \cdot \frac{363}{365} \cdot \cdot \cdot \frac{326}{365} \\ \approx 89.1\% \end{array}$$

#### Counter-intuitive

Among 40 strangers, there is almost a 90% chance that two of them share a birthday!!!

► General assumption that Question 1 & 2 have essentially the same answer.

# The Birthday Paradox

To put things in perspective

- ► It requires only 23 people to have a better than 50% chance of a matched birthday while
- ► It takes **253** people to have better than a **50**% chance of finding someone who has your birthday

Can you see the link of the **Birthday Paradox** with the problem of **collision finding** in hash functions?

# The Collision Problem

ightharpoonup Let us try to find Pr(Collision) using k out of n messages

# Collision Probability in General

Derivation of Pr(Collision) using k out of n message and the relation with the number of messages has been shown in class.

$$Pr(Collision) \approx 1 - e^{-\frac{k(k-1)}{2n}} \leftarrow for large n$$

► For 
$$Pr(Collision) = \frac{1}{2}$$

$$k \approx 1.1774\sqrt{n}$$
  $\leftarrow$  for large  $k$ 



- ► Given *N* messages and as many hash values
- ► Total number of **potential** collisions producible
- ► Considering each pair of two hash values

$$\binom{N}{2} = \frac{N \times (N-1)}{2} \to O(N^2)$$

Connect this with the result from the previous slide.

# A Comparative Understanding

## Preimage Search

N messages only give N candidate preimages

#### Collision Search

Same N messages give  $\approx N^2$  potential collisions

#### Observe

- With  $N^2$  instead of N there are <u>quadratically</u> more chances to find a solution.
- ► The complexity of the search is in turn <u>quadratically</u> lower.

#### The Verdict

In order to find a collision, # messages needed  $\to \sqrt{2^n}$ 

 $2^{\frac{n}{2}}$  instead of  $2^n$ 

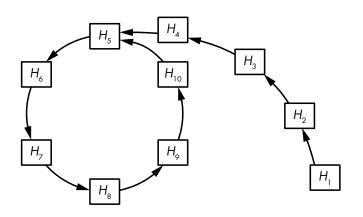
# The Naive Birthday Attack

# Simplest Way

- ► Compute  $2^{\frac{n}{2}}$  hashes of  $2^{\frac{n}{2}}$  arbitrarily chosen messages and store all the message/hash pairs in a list
- ► Sort the list with respect to the hash value
- ► Search the sorted list to find two consecutive entries with the same hash value

# Complexity

- ► Huge memory:  $2^{\frac{n}{2}}$  message/hash pairs
- ▶ Sorting:  $O(n2^n)$



$$H_{i+1} = \frac{Hash(H_i)}{H'_{i+1}}$$
 $H'_{i+1} = \frac{Hash(Hash(H'_i))}{H'_{i+1}}$ 

 $\leftarrow \mathsf{Baby} \; \mathsf{Step}$ 

 $\leftarrow \mathsf{Giant}\ \mathsf{Step}$ 

Note

## Memory requirement is negligible

- ▶ The Rho method takes about  $2^{\frac{n}{2}}$  operations to succeed
- ▶ On average, the **cycle** and the **tail** each include about  $2^{\frac{n}{2}}$  hash values
- ▶ *n* is the bit length of the hash values.

# Hash evaluations to find a collision

$$\geq \left(2^{\frac{n}{2}}+2^{\frac{n}{2}}\right)$$