

Birthday Paradox $O(\sqrt{\text{days}})$  $k$  people in room $p(\text{two have same birthday}) \rightarrow$  instead,  $1 - p(\text{two don't have same birthday})$ 

$k$	prob	
1	0	
2	$(1 - 1/365)$	$\prod_{c=1}^{k-1} (1 - c/365)$
3	$(1 - 1/365) \times (1 - 2/365)$	
4	$\dots \times (1 - 3/365)$	$k = 23$ (more likely than not pair has same bday)

Balls and Bins $m$  bins,  $n$  balls

What fraction of the bins are empty?

$$\text{prob}(\text{bin \#1 is empty}) = (1 - 1/m)^n \approx e^{-n/m}$$

Linearity of Expectations

$$\mathbb{E}[\# \text{ empty bins}] = m(1 - 1/m)^n \approx m e^{-n/m}$$

What is the expected # of bins with 1 ball?

$$\text{Pr}(\text{bin \#1 gets 1 ball}) : \binom{n}{1} \frac{1}{m} (1 - 1/m)^{n-1}$$

## Hash Functions

$$H: \mathcal{U} \rightarrow \{0, \dots, m-1\}$$

Good hash functions look random

Usage: distribute items so you can look them

## Password checking

- prevent bad passwords
  - small space complexity (w/ some mistakes)
- rather than people to not use a safe pass than to use unsafe pass

m bits

0	1	0	0	1	0	0	1
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H:

if 0 → okay!

$$H(x) \rightarrow 0 \text{ to } m-1$$

1 → not okay, might have

set that bit to 1

been a bad password

n bad passwords, m bits in Hash

$$p(\text{say bad even though password is good}) = \frac{\#1s}{m} = 1 - e^{-n/m}$$

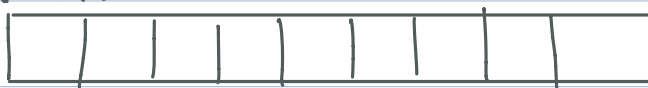
$$p(\text{good}) = \frac{m e^{-n/m}}{m} = e^{-n/m}$$

## Bloom Filter

m bits, n items

k hash functions

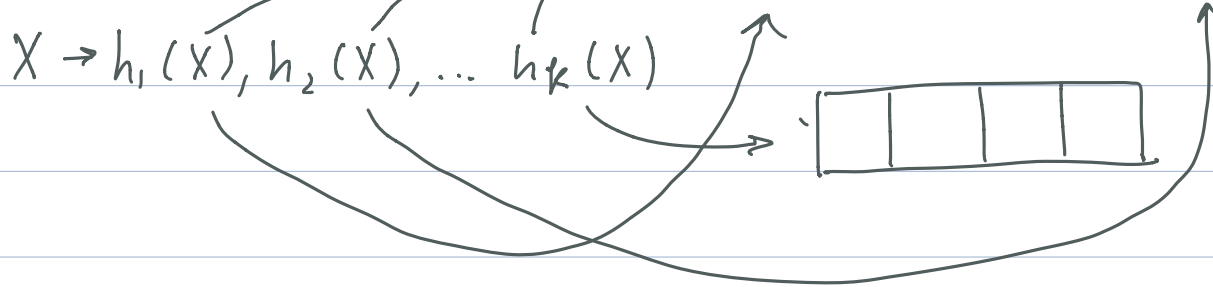
m bits



good password: at least 1 0  
option 1



option 2



$$p(\text{reject good password}) = (1 - e^{-n/(m/k)})^k = (1 - e^{-nk/m})^k$$

$$k = \frac{m}{n} \log 2 \rightarrow \text{optimal \# of hash functions}$$

using 1 byte/item, false prob down to 2%!