#### COT 6936: Topics in Algorithms

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## **Bloom Filters**

 Used to test set membership by using bit arrays to indicate which positions have been hashed to.



- Use k hash functions instead of 1.
- How large should k be for given error bound?

# Power of Two (or d) Choices

- Each ball comes with d = 2 possible bins, each chosen independently at random
- Ball is placed in the least full bin among the d choices
  - ties broken arbitrarily
- MAGICALLY, with high prob:
  - MAX LOAD =  $\ln \ln n / \ln 2 + O(1)$
  - Down from  $\Theta(\ln n / \ln \ln n)$  (when d = 1)
  - In general, when  $d \ge 2$ ,
    - MAX LOAD =  $\ln \ln n / \ln d + \Theta(1)$

# **Applications**

- Hashing with 2-way chaining
  - 2 hash function applied to each data item
  - Item inserted in shorter of two chains
- Dynamic Resource Allocation
  - Choosing a server among servers in a network
  - Choosing a disk to store an entity
  - Choosing a printer to serve a print job

#### COT 6936: Topics in Algorithms

# Online Algorithms

### **Online Problems**

- Should I buy a car/skis/camping gear or rent them when needed?
- Should I buy Google stocks today or sell them or hold on to them?
- Should I work on my homework in Algorithms or my homework in OS or on my research?
- Decisions have to be made based on past and current request/task

# How to Analyze Online Algorithms?

- Competitive analysis
  - Compare with optimal offline algorithm (OPT)
- Algorithm A is a-competitive if there exists constants b such that for every sequence of inputs σ:
  - $cost_A(\sigma) \le acost_{OPT}(\sigma) + b$

## **Ski Rental Problem**

- Should Dr. Raju buy skis or rent them?
  - Rental is \$A per trip
  - Purchase costs \$B
- Idea:
  - Rent for m trips, where
    - $\cdot$  m = B/A
  - Then purchase skis
- Analysis:

- Competitiveness ratio = 2. Why?

# Paging Problem

- Given 2-level storage system
  - Limited Faster Memory (k pages) "CACHE"
  - Unlimited Slower Memory
- Input: Sequence of page requests
- Assumption: "Lazy" response (Demand Paging)
  - If page is in CACHE, no changes to contents
  - If page is not in CACHE, make place for it in CACHE by replacing an existing page
- Need: A "page replacement" algorithm

Infinite,

Online

# Well-known Page Replacement Algorithms

- LRU: evict page whose most recent access was earliest among all pages
- FIFO: evict page brought in earliest
- LIFO: evict page brought in most recently
- LFU: evict page least frequently used

# **Comparing online algorithms?**

- Game between Cruel Adversary and your Analyze: time? performance?
  - Input length?
  - Performance depends on request s ence ocess
    - Probabilistic models? Markov Decisio
- Competitive analysis [Sleator an /Tarjan]
  - Compare with optimal offline algor, thm (OPT)
    - OPT is clairvoyant; no prob assumptions; "worst-case"
- Algorithm A is a-competitive if there exists constants b such that for every  $\sigma$ :
  - $cost_A(\sigma) \leq acost_{OPT}(\sigma) + b$

algorithm

# **Optimal Algorithm for Paging**

- MIN (Longest Forward Distance): Evict the page whose next access is latest.
- Cost: # of page faults
- Competitive Analysis: Compare
  - # of page faults of algorithm A with
  - # of page faults of algorithm MIN
- We want to compute the competitiveness of LRU, LIFO, FIFO, LFU, etc.

# Lower Bound for any algorithm

- Cannot achieve better than k-competitive!
  - No algorithm is a-competitive for a< k
    - Fix algorithm A,
    - $\boldsymbol{\cdot}$  Construct a request sequence  $\boldsymbol{\sigma},$  and
    - Show that:  $cost_A(\sigma) \ge k cost_{OPT}(\sigma)$
- Sequence  $\sigma$  will only have k+1 possible pages
  - make 1..k+1 the first k+1 requests
  - make next request as the page evicted by algorithm A
    Adversary Model
    - A will fault on every request
    - OPT? Will fault every k requests

# Upper Bound: LRU is k-Competitive

- Observation: if any subseq has k+1 distinct pages, MIN (any alg) faults at least once
  - Let p be 1<sup>st</sup> request; p is in CACHE (LRU & MIN)
  - Let T be any subsequence of  $\sigma$  with exactly k faults for LRU & with p accessed just before T.
  - LRU cannot fault on same page twice within T
    - Otherwise it will have faults on k+1 different pages
  - LRU cannot fault on p within T
    - Otherwise it will have faults on k+1 different pages
  - Thus, p followed by T requests k+1 distinct pages and MIN must fault at least once in T

# LRU is k-competitive

- Partition σ into subsequences as follows:
  - Let s<sub>0</sub> include the first request, p, and the first k faults for LRU
  - Let  $s_i$  include subsequence after  $s_{i-1}$  with the next k faults for LRU
  - Argument applies for  $T = s_i$ , for every i > 0
  - If both algorithms start with empty CACHE or identical CACHE, then it applies to i = 0 also
  - Otherwise, LRU incurs k extra faults
- Thus,  $cost_A(\sigma) \le k cost_{OPT}(\sigma) + k$

#### **Other Page Replacement Algorithms**

- FIFO is k-competitive (Homework!)
- MFU and LIFO?

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# How to Analyze Rand Online Algorithms?

- Algorithm A is a-competitive if there exists constants b such that for every sequence of inputs σ:
  - $cost_A(\sigma) \leq acost_{OPT}(\sigma) + b$
- Randomized Algorithm R is a-competitive if there exists constants b such that for every sequence of inputs  $\sigma$ :
  - $E[cost_R(\sigma)] \le acost_{OPT}(\sigma) + b$

Adversary provides request sequence at start